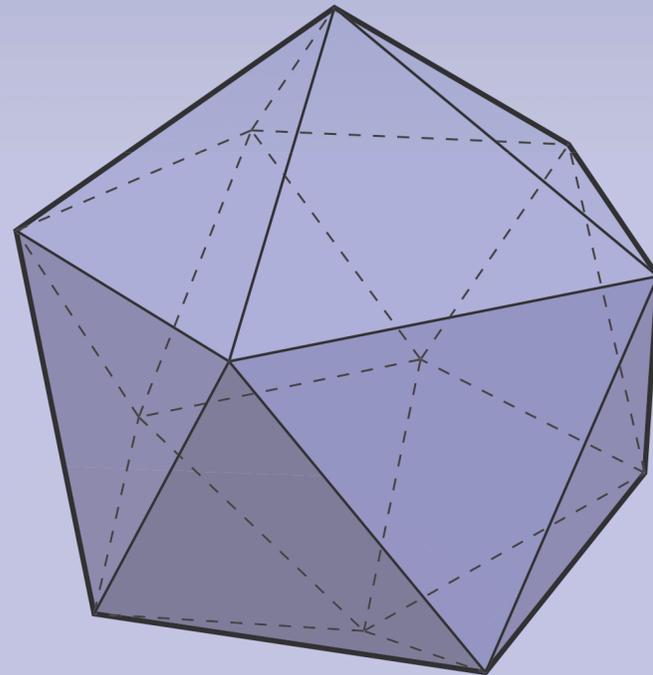


DISCRETE DIFFERENTIAL  
GEOMETRY:  
AN APPLIED INTRODUCTION  
Keenan Crane • CMU 15-458/858B • Fall 2017

LECTURE 3:  
EXTERIOR ALGEBRA



DISCRETE DIFFERENTIAL  
GEOMETRY:  
AN APPLIED INTRODUCTION

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# Where Are We Going Next?

**GOAL:** develop *discrete exterior calculus (DEC)*

Prerequisites:

**Linear algebra:** “little arrows” (vectors)

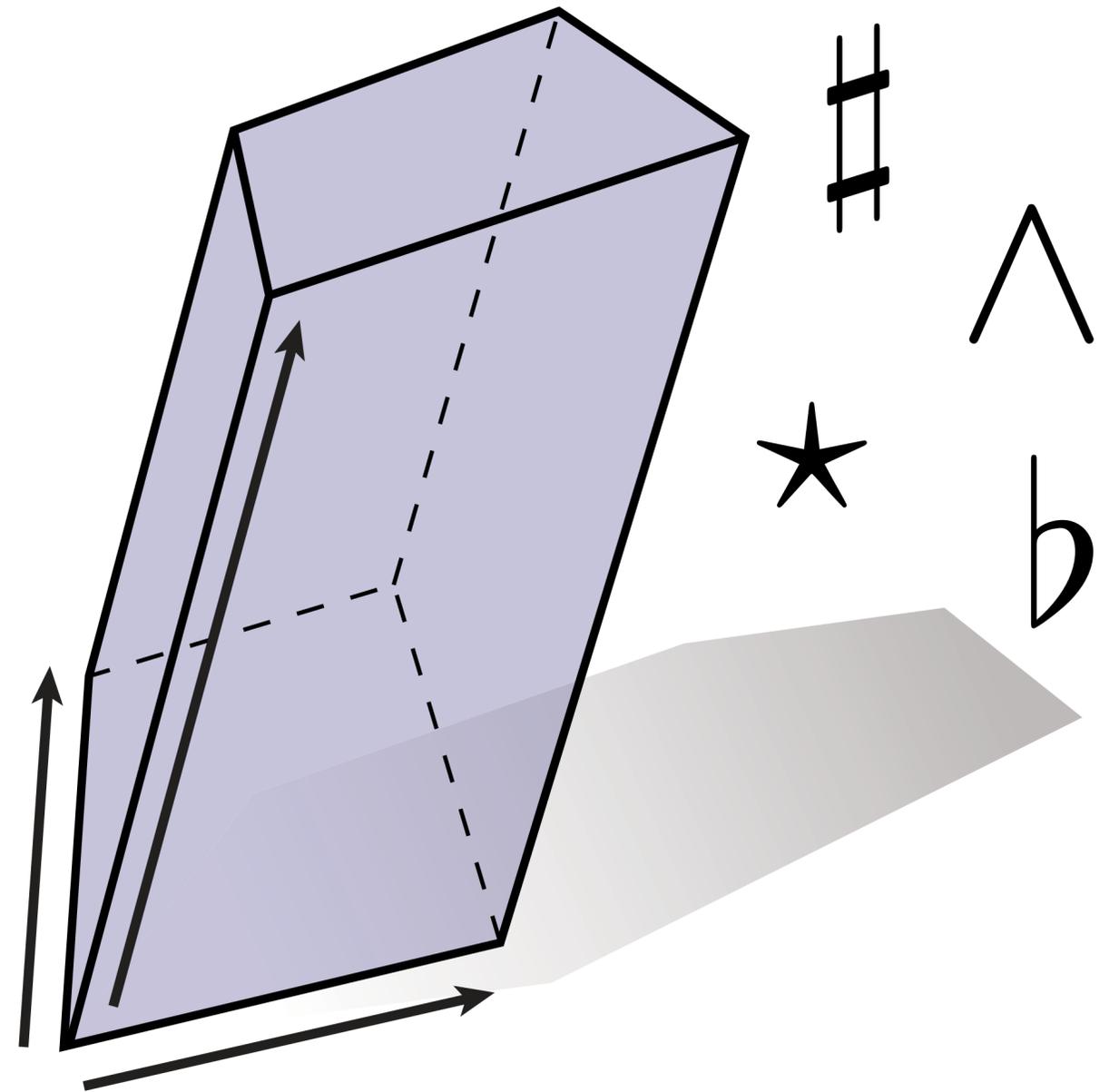
**Vector Calculus:** how do vectors *change*?

Next few lectures:

**Exterior algebra:** “little volumes” ( $k$ -vectors)

**Exterior calculus:** how do  $k$ -vectors change?

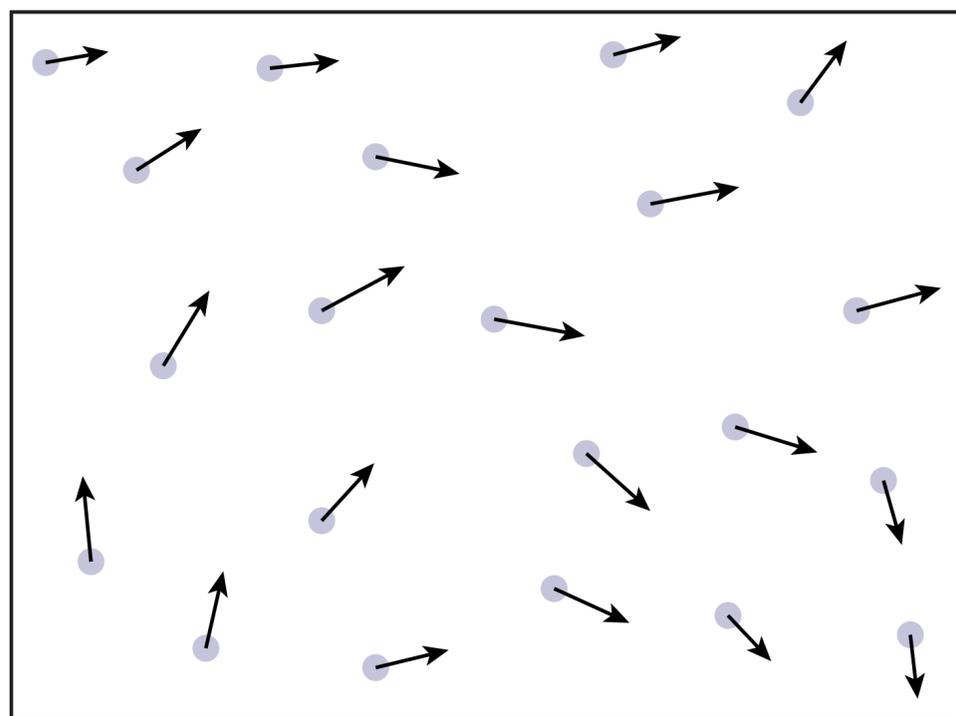
**DEC:** how do we do all of this on meshes?



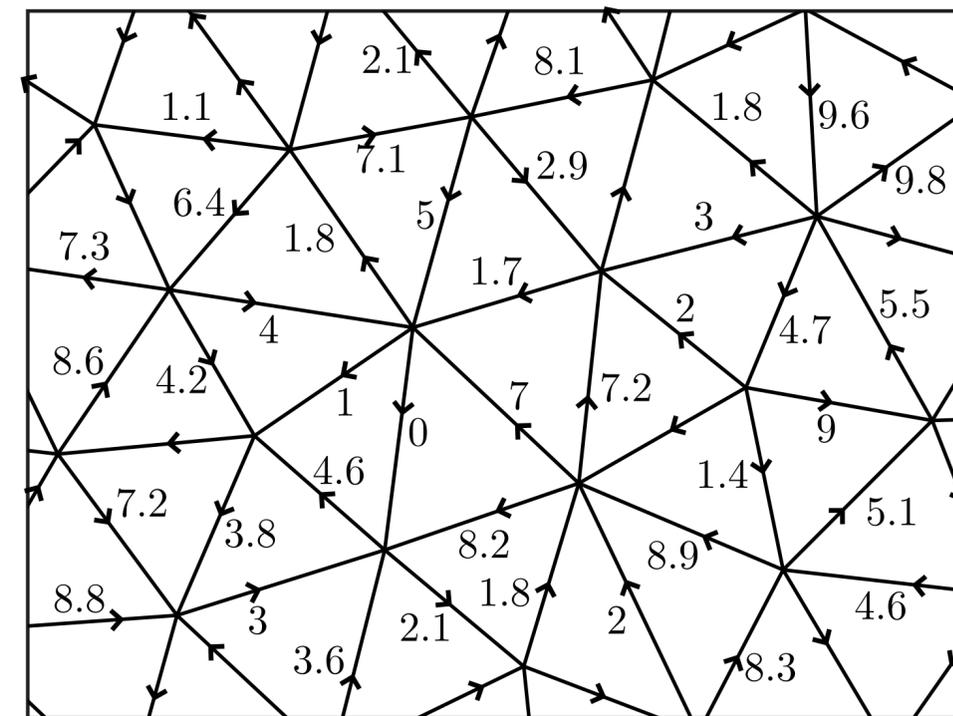
**Basic idea:** replace vector calculus with computation on meshes.

# Why Are We Going There?

- **TLDR:** *So that we can solve equations on meshes!*



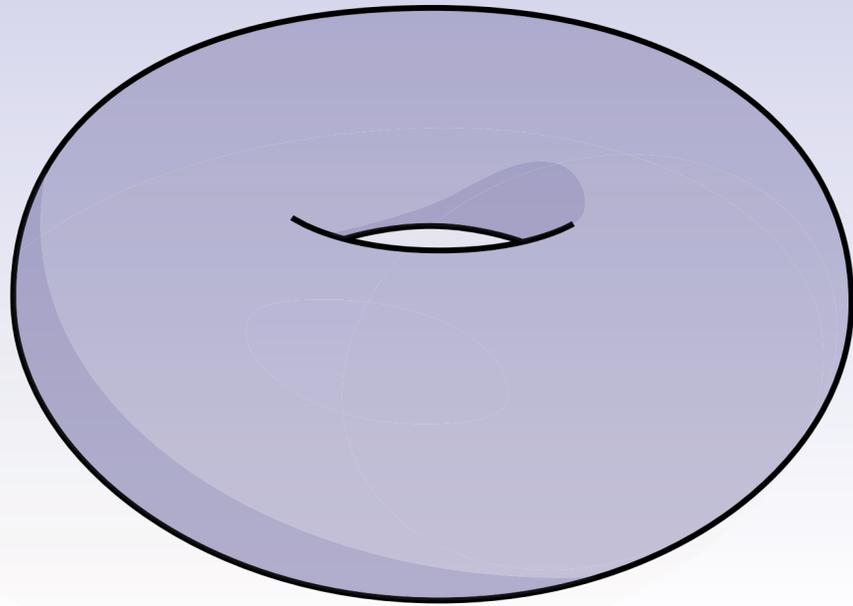
**integrate**



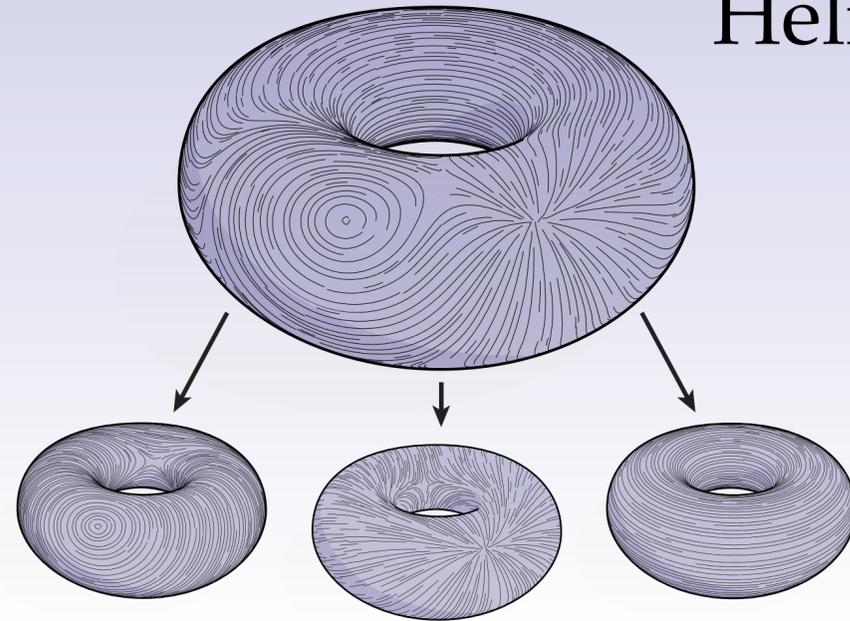
- Geometry processing algorithms solve *equations on meshes*
  - Meshes are made up of little *volumes*
- ⇒ Need to learn to *integrate equations over little volumes* to do computation!

# Basic Computational Tools

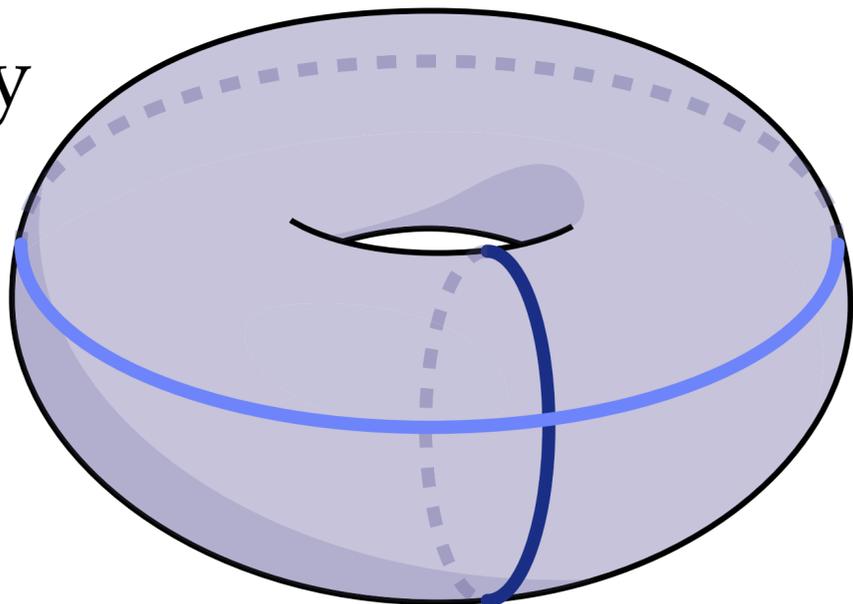
Poisson



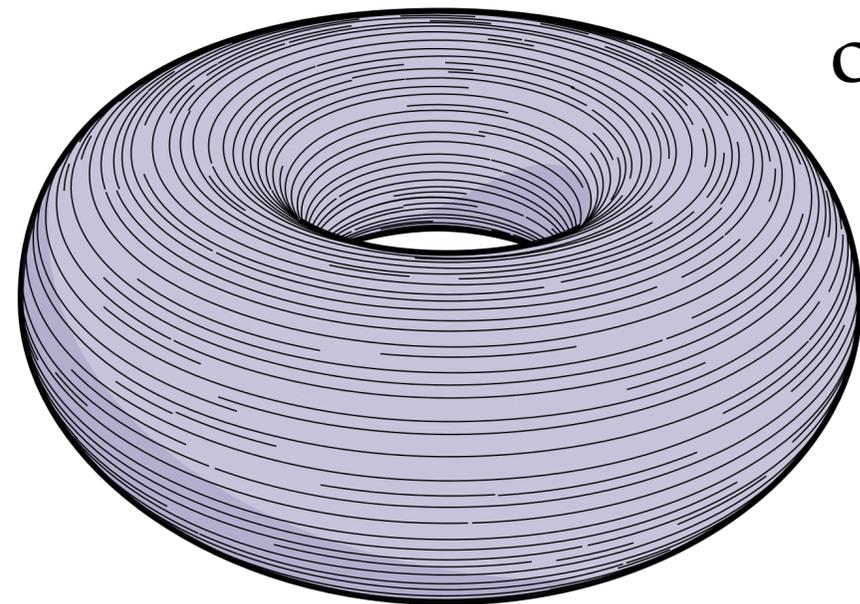
Helmholtz-Hodge



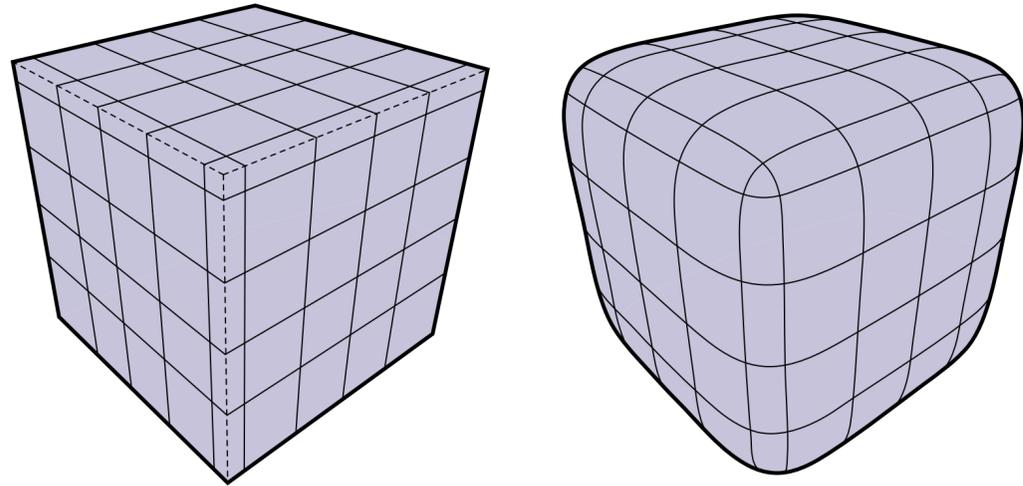
homology



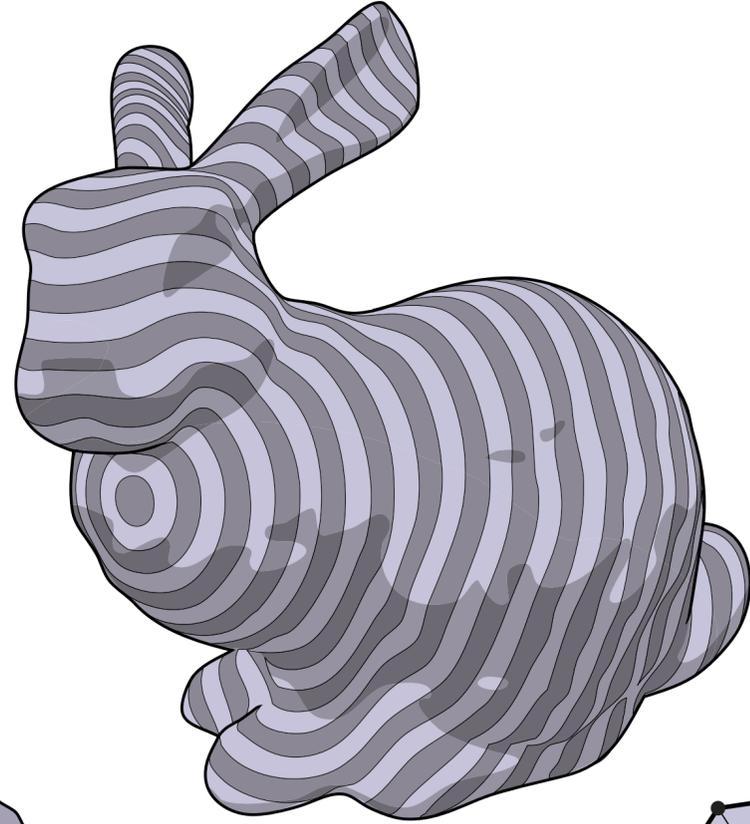
cohomology



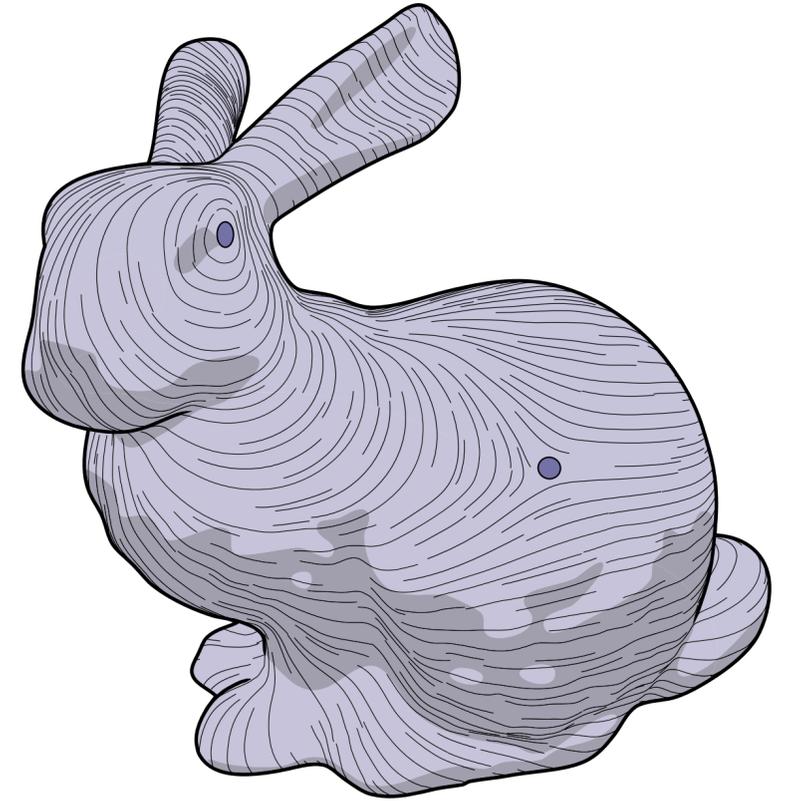
# Applications



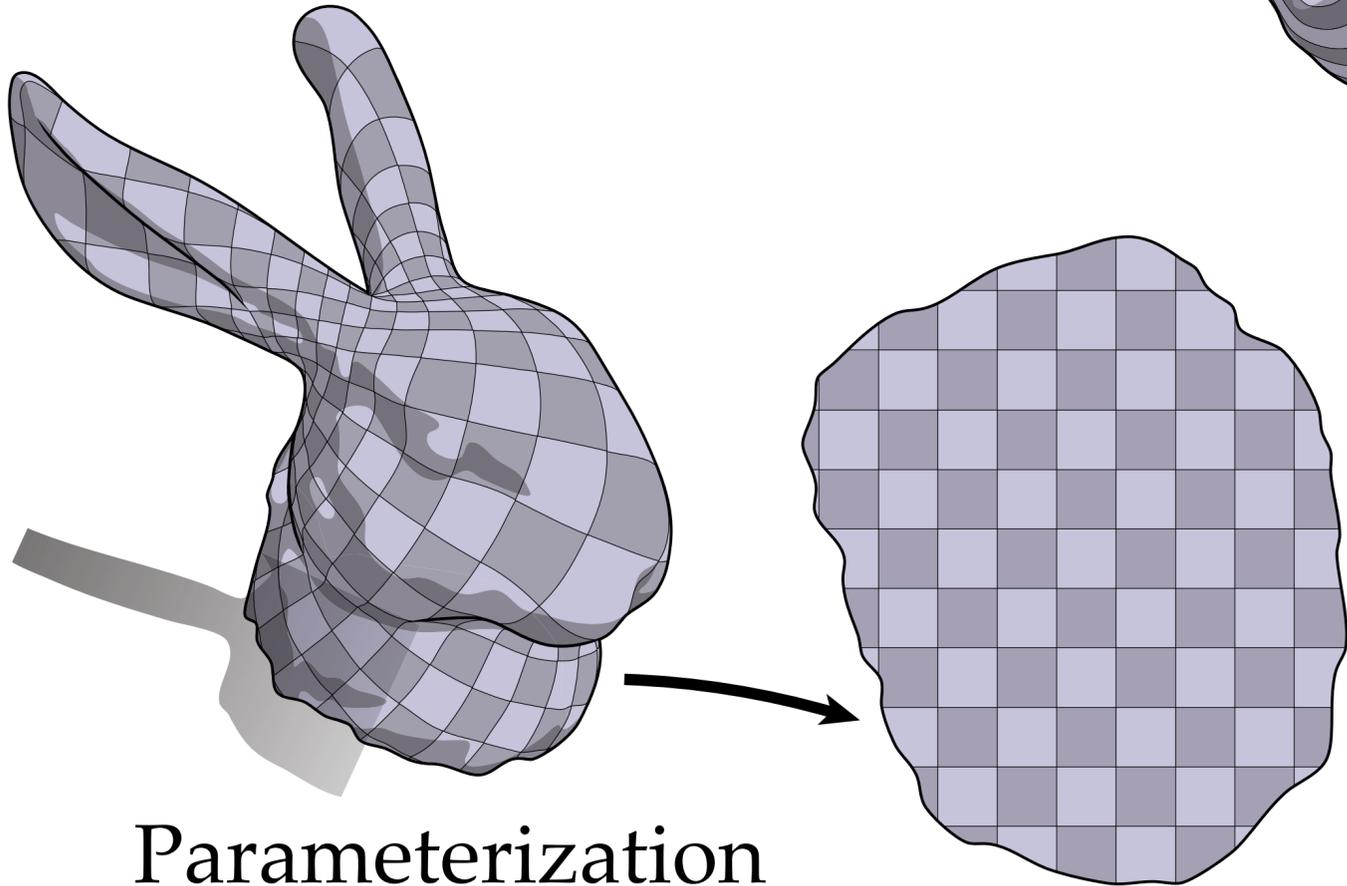
Smoothing



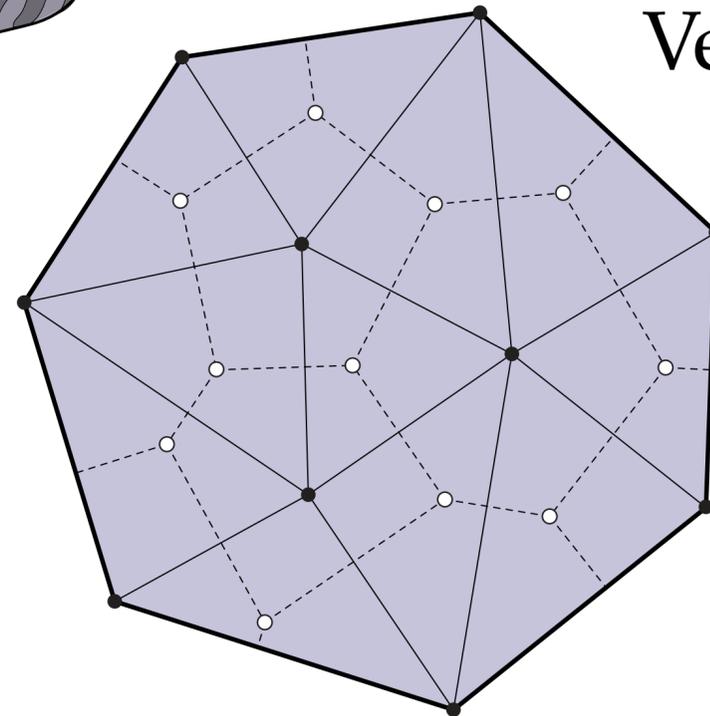
Distance



Vector Field Design

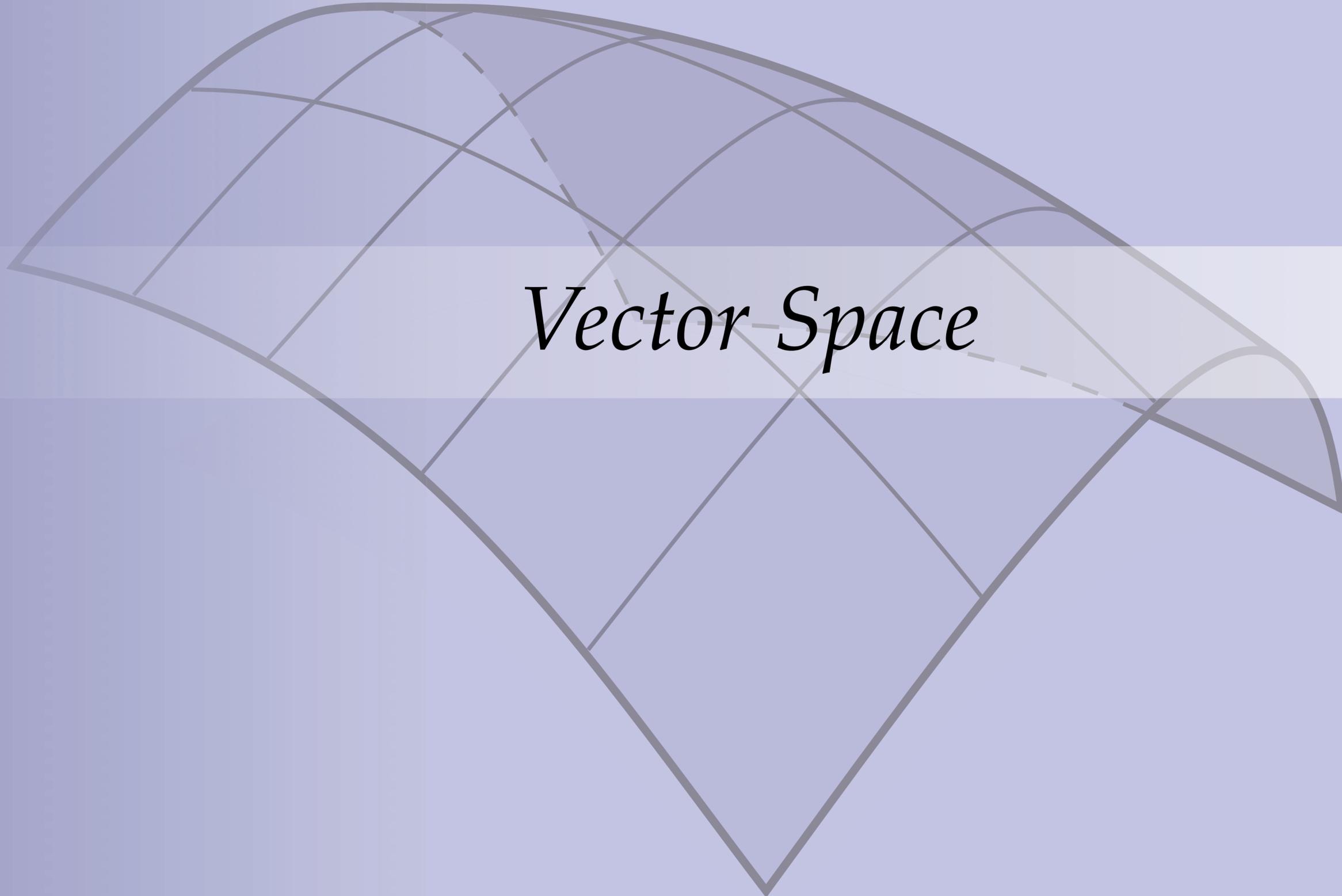


Parameterization



Meshing

*...and more!*

A stylized graphic representing a vector space. It features a central text label "Vector Space" in a black, italicized serif font. The text is positioned within a light blue, semi-transparent, curved shape that resembles a lens or a sector of a circle. This shape is overlaid on a background of a light blue gradient. The graphic is composed of several curved lines that intersect to form a grid-like pattern, suggesting a coordinate system or a basis for the vector space. The lines are thin and light blue, matching the overall color scheme. The overall composition is clean and modern, with a focus on geometric and mathematical concepts.

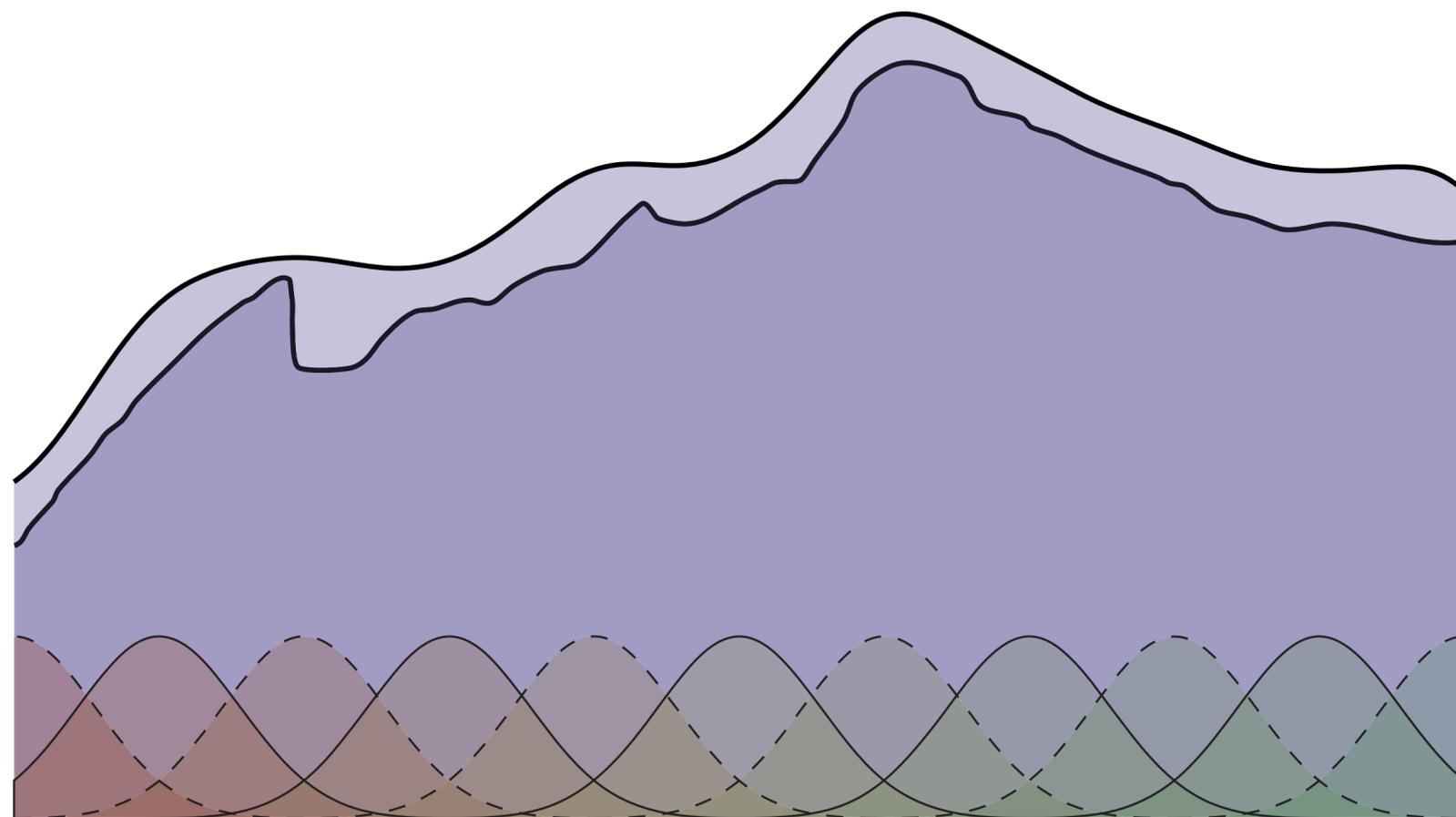
*Vector Space*

# Review: Vector Spaces

- What is a vector? (*Geometrically?*)



**finite-dimensional**



**infinite-dimensional**

For geometric computing, often care most about dimensions 1, 2, 3, ...and  $\infty$ !

# Review: Vector Spaces

- Formally, a *vector space* is a set  $V$  together with a binary operations\*

$$+ : V \times V \rightarrow V \quad \text{“addition”}$$

$$\cdot : \mathbb{R} \times V \rightarrow V \quad \text{“scalar multiplication”}$$

- Must satisfy the following properties for all vectors  $x, y, z$  and scalars  $a, b$ :

$$x + y = y + x$$

$$(ab)x = a(bx)$$

$$(x + y) + z = x + (y + z)$$

$$1x = x$$

$$\exists 0 \in V \text{ s.t. } x + 0 = 0 + x = x$$

$$a(x + y) = ax + ay$$

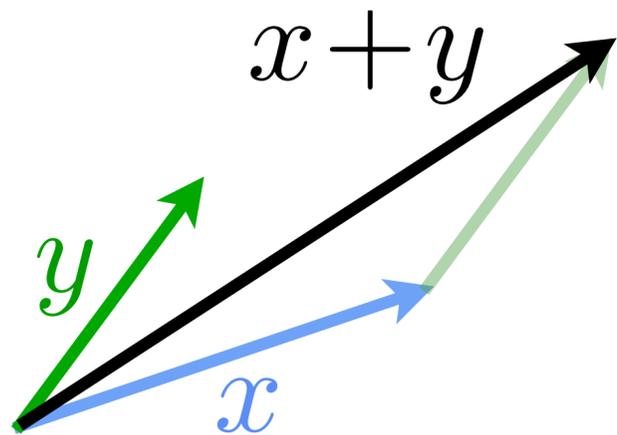
$$\forall x, \exists \tilde{x} \in V \text{ s.t. } x + \tilde{x} = 0$$

$$(a + b)x = ax + bx$$

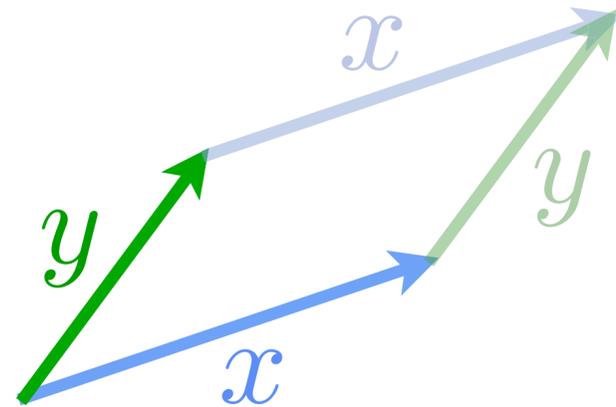
\*Note: in general, could use something other than *reals* here.

# Vector Spaces — Geometric Reasoning

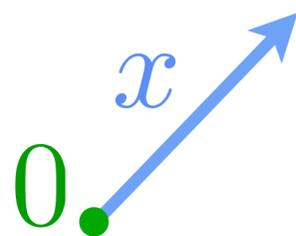
- Where do these rules come from?
- As with numbers, reflect how *oriented lengths* (vectors) behave in nature.



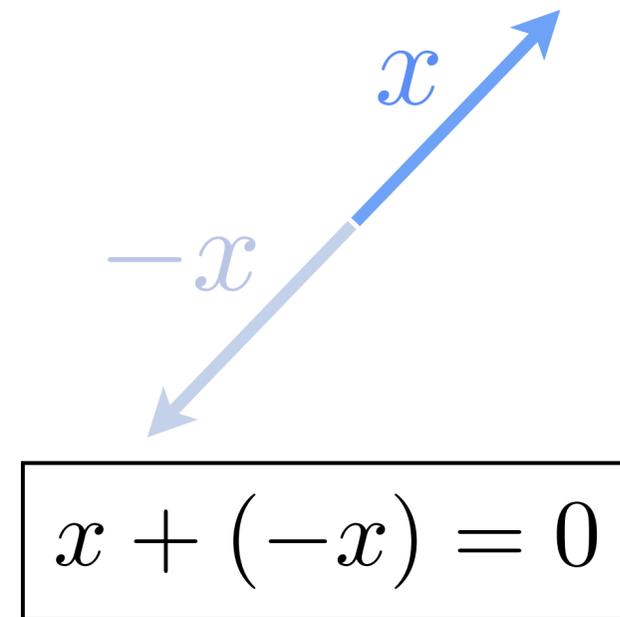
$$x + y \in V$$



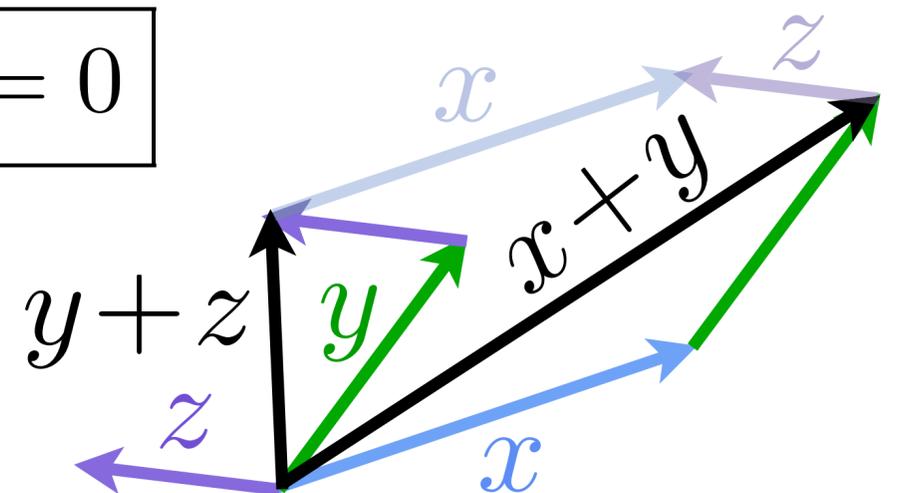
$$x + y = y + x$$



$$x + 0 = x$$



$$x + (-x) = 0$$



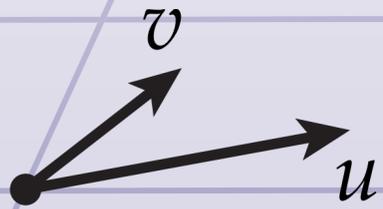
$$(x + y) + z = x + (y + z)$$



*Wedge Product*

# Review: Span

**Q:** Geometrically, what is the *span* of two vectors?



$$u, v \in V, \quad \text{span}(\{u, v\}) := \{x \in V \mid x = au + bv, a, b \in \mathbb{R}\}$$

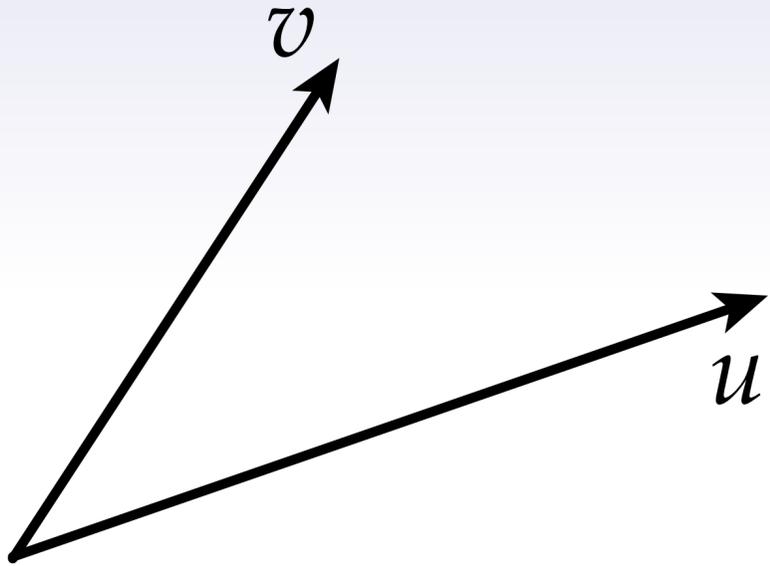
# Span

**Definition.** In any vector space  $V$ , the *span* of a finite collection of vectors  $\{v_1, \dots, v_k\}$  is the set of all possible linear combinations

$$\text{span}(\{v_1, \dots, v_n\}) := \left\{ x \in V \mid x = \sum_{i=1}^k a_i v_i, \quad a_i \in \mathbb{R} \right\}.$$

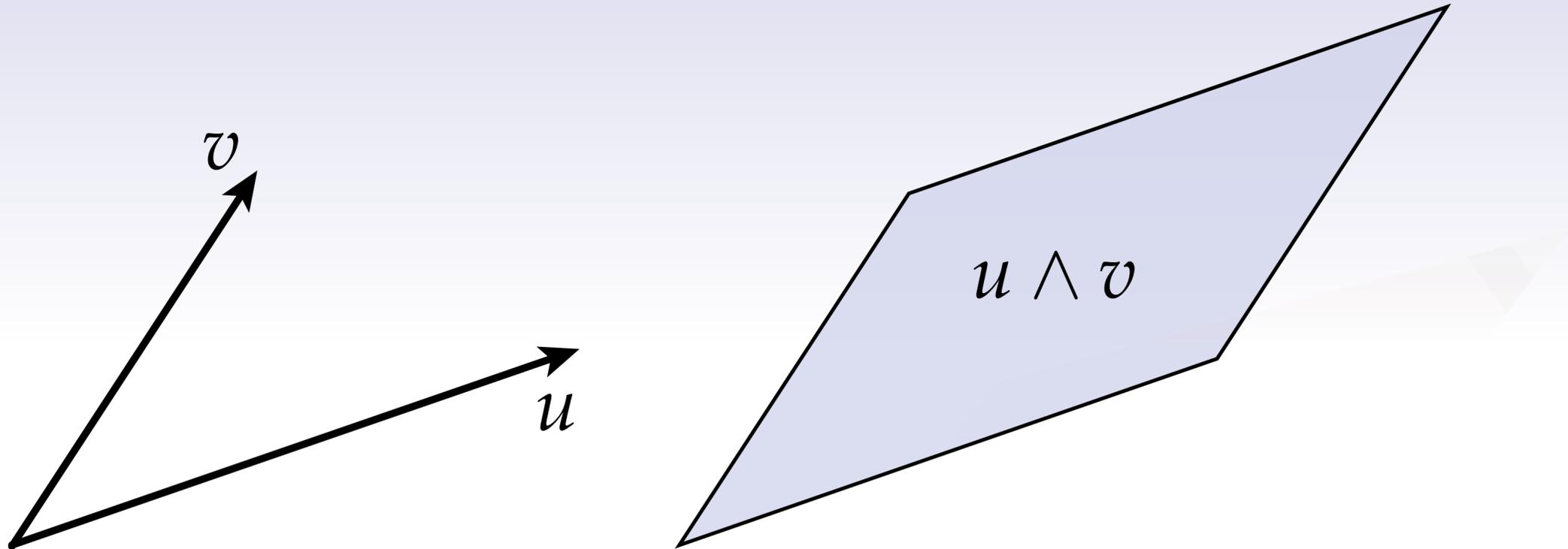
(*Note:* one cannot extend this definition to infinite sums without additional assumptions about  $V$ .) The span of a collection of vectors is a *linear subspace*, *i.e.*, a subset that forms a vector space with respect to the original vector space operations.

# *Wedge Product* ( $\wedge$ )



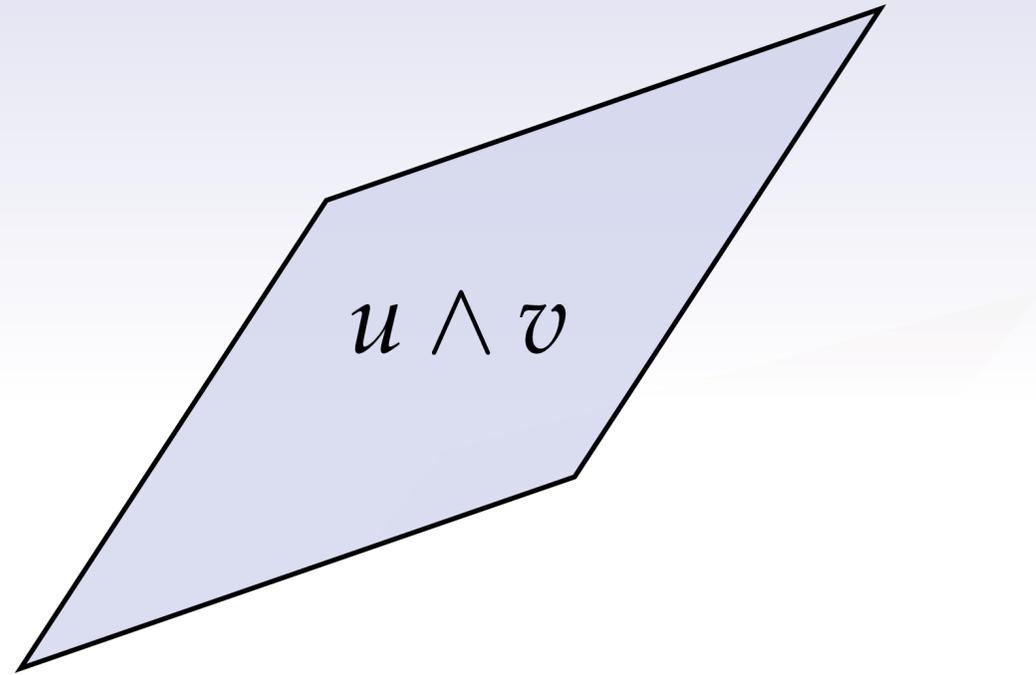
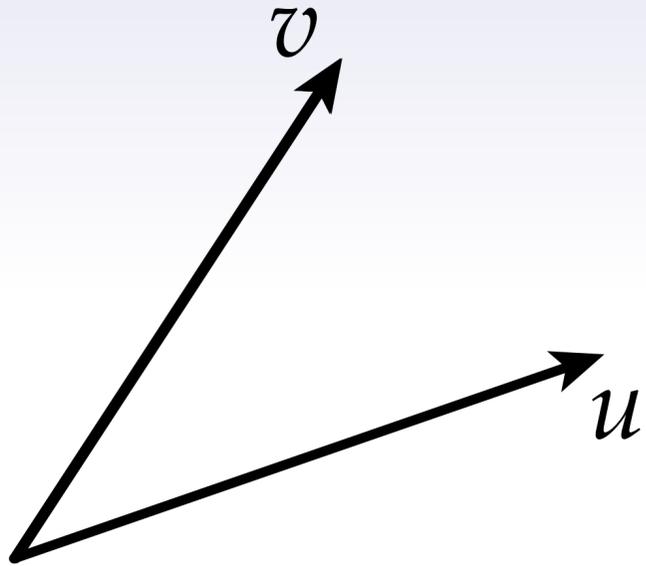
**Analogy:** *span*

# Wedge Product ( $\wedge$ )



**Analogy:** *span*

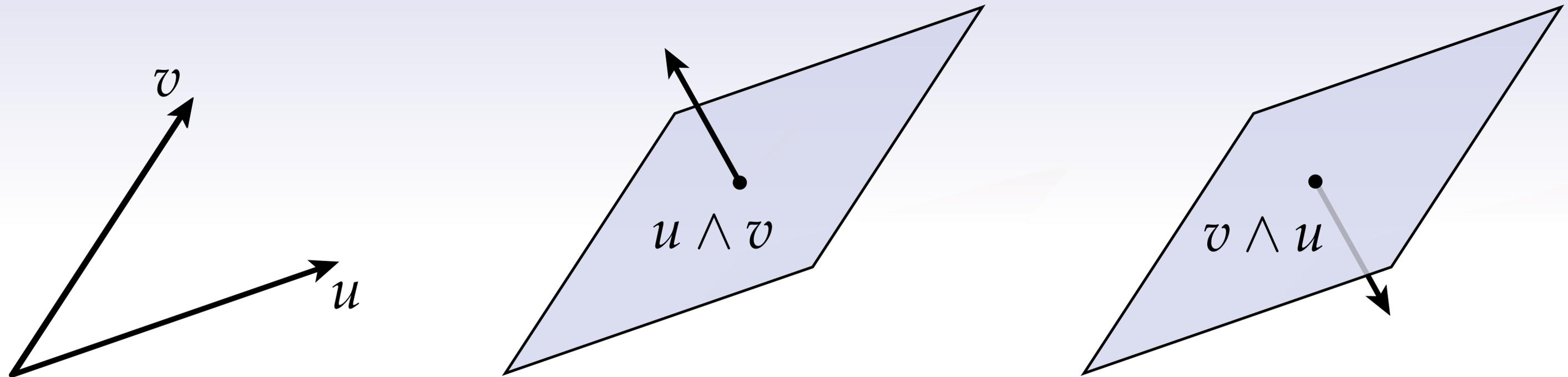
# Wedge Product ( $\wedge$ )



**Analogy:** *span*

# Wedge Product ( $\wedge$ )

$$u \wedge v = -v \wedge u$$



**Analogy:** *span*

**Key differences:** orientation & “finite extent”

**Key property:** *antisymmetry*

# *Wedge Product—Degeneracy*

**Q:** What is the wedge product of a vector with itself?

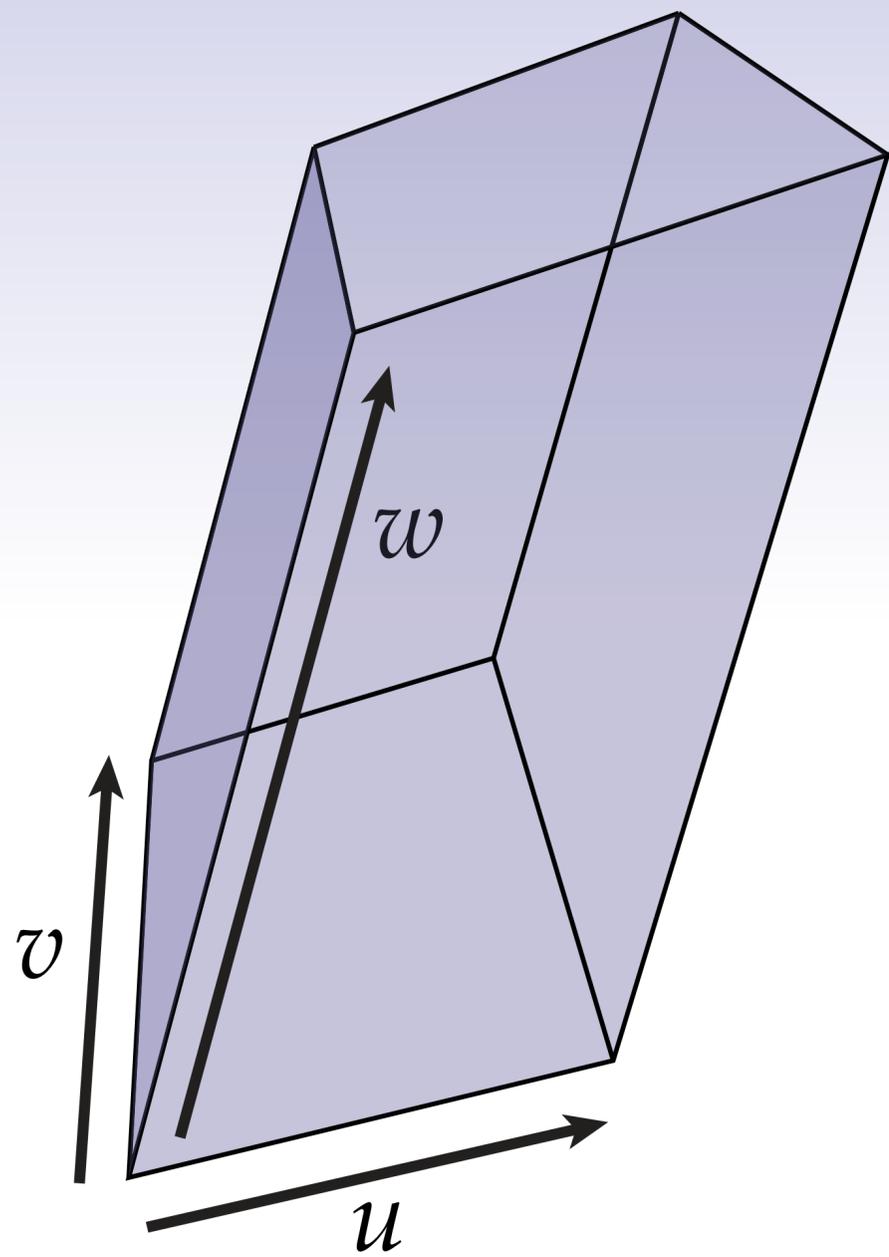


**A:** Geometrically, spans a region of *zero area*.

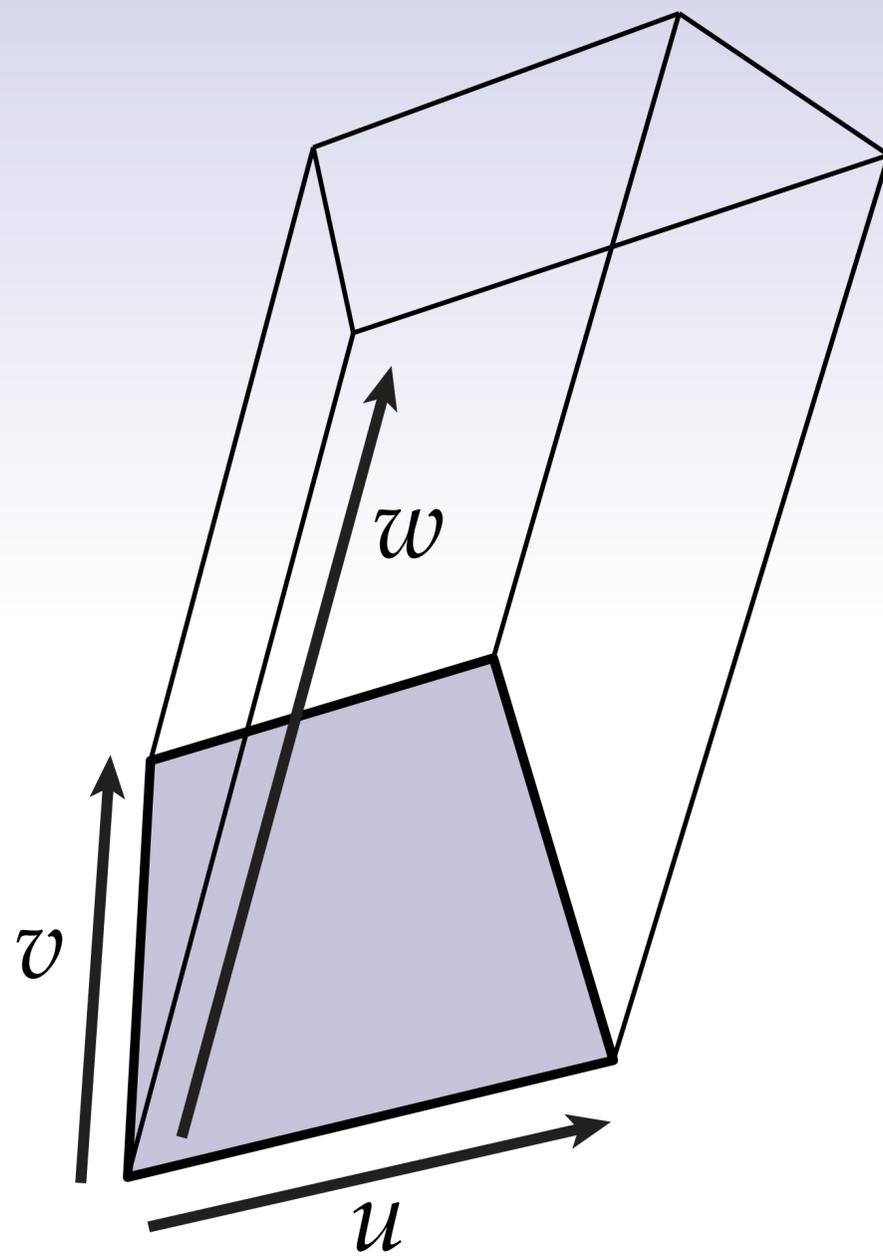
$$u \wedge u = 0$$

(\*Slight oversimplification. More later...)

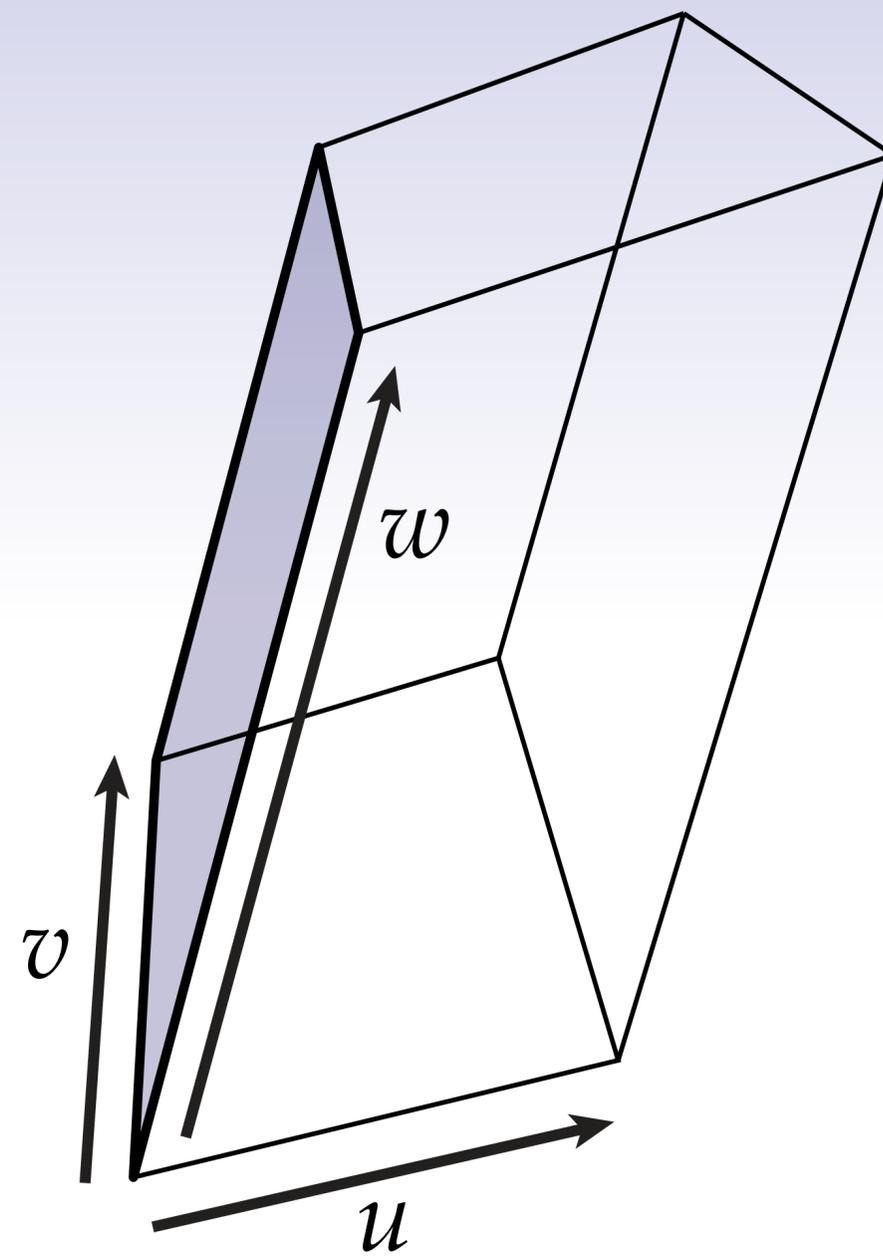
# Wedge Product - Associativity



$$u \wedge v \wedge w$$

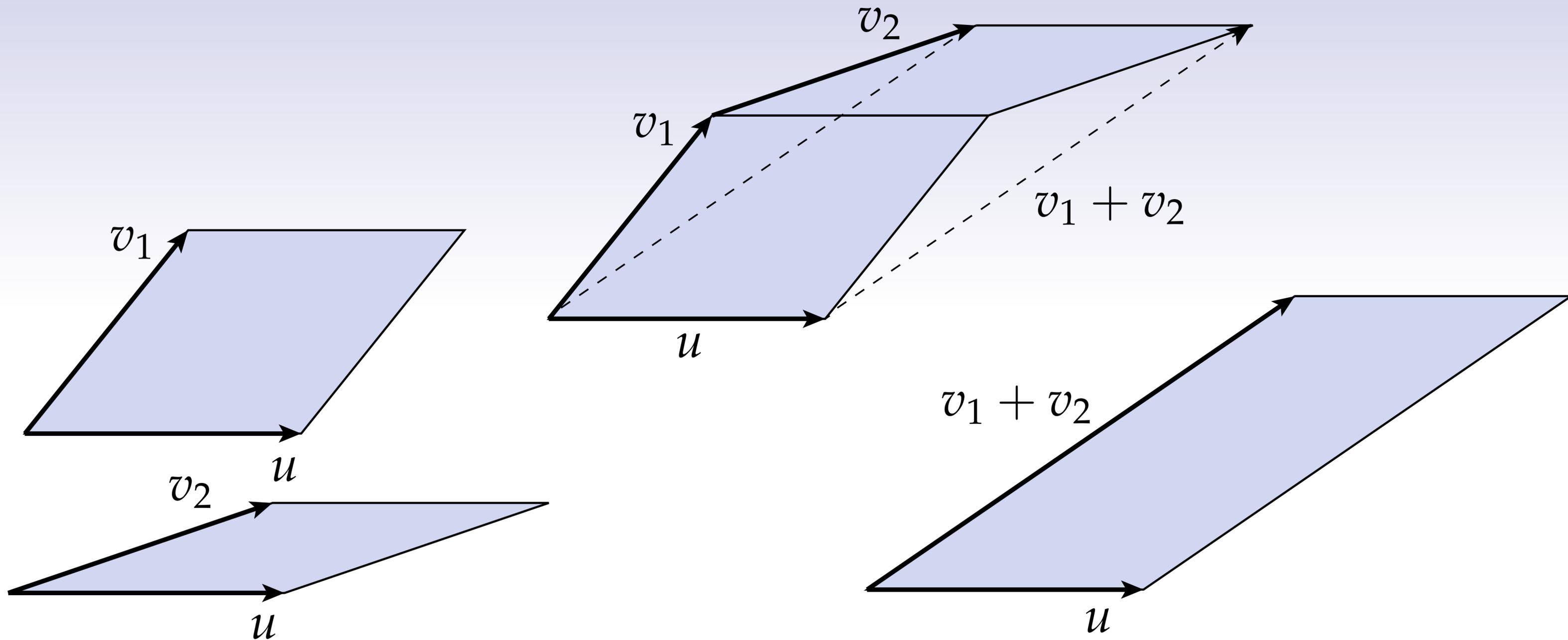


$$(u \wedge v) \wedge w$$



$$u \wedge (v \wedge w)$$

# Wedge Product - Distributivity



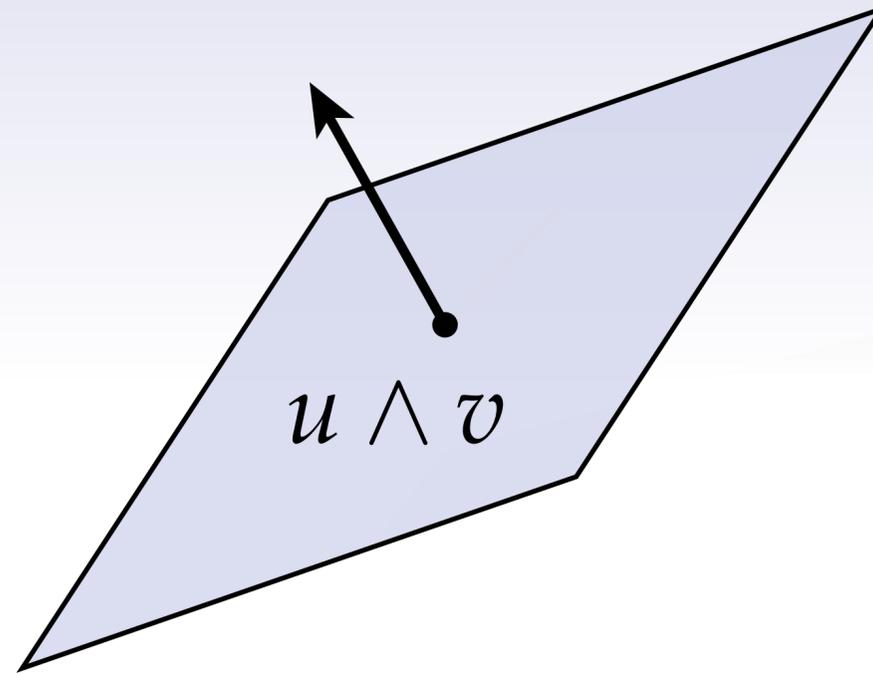
$$u \wedge v_1 + u \wedge v_2 = u \wedge (v_1 + v_2)$$

# *k*-Vectors

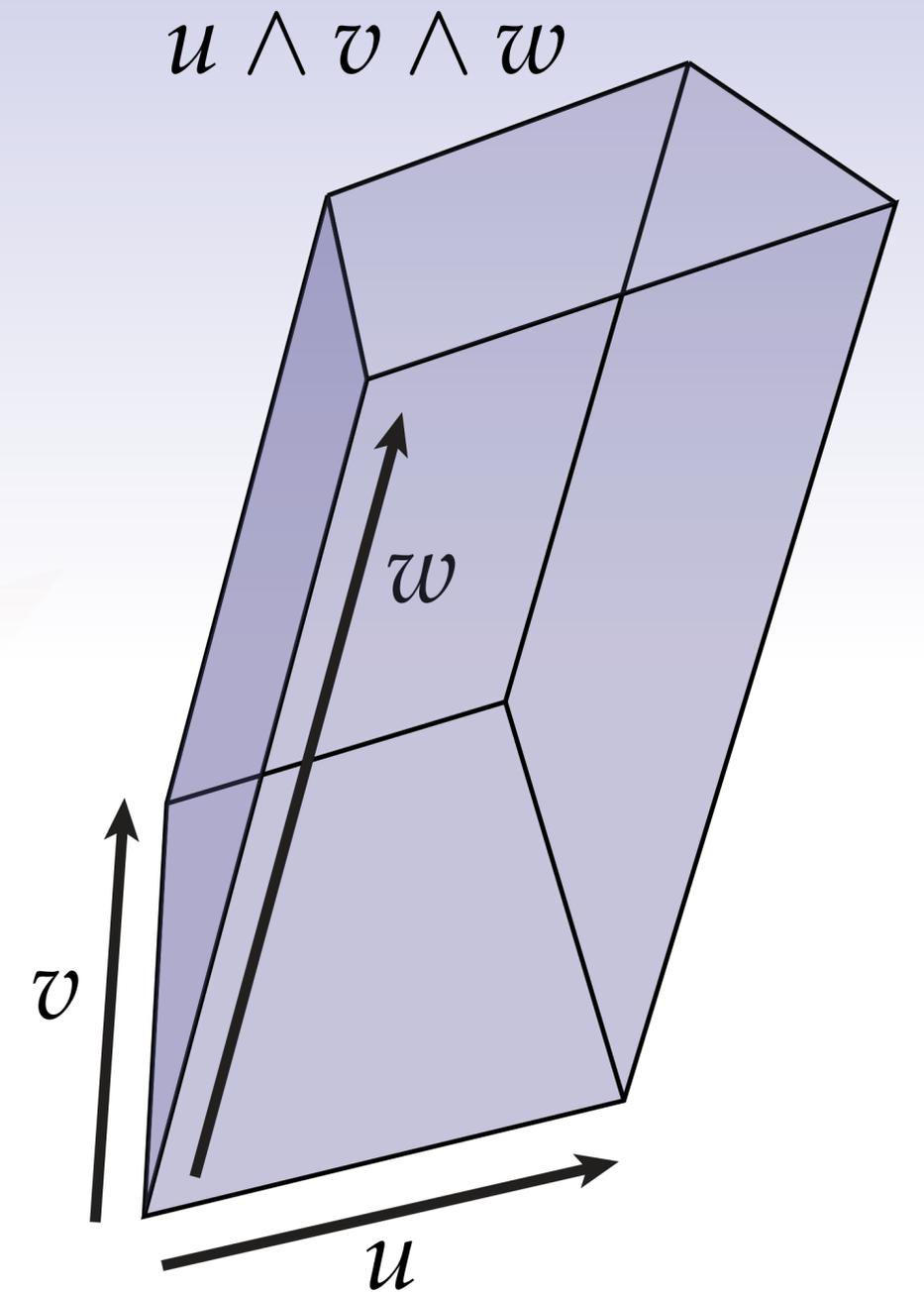
The wedge of  $k$  vectors is called a "*k*-vector."



**1-vector**



**2-vector**



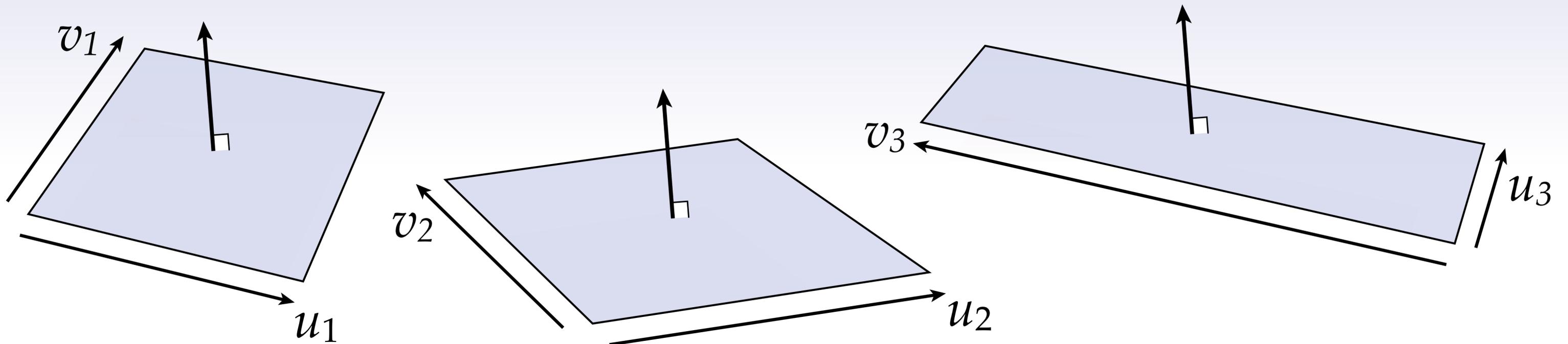
**3-vector**

**0-vector**

# Visualization of $k$ -Vectors

Our visualization is a little misleading:  $k$ -vectors only have *direction & magnitude*.

E.g., parallelograms w/ same plane, orientation, and area represent same 2-vector:



$$u_1 \wedge v_1 = u_2 \wedge v_2 = u_3 \wedge v_3$$

(Could say a 2-vector is an *equivalence class* of parallelograms...)

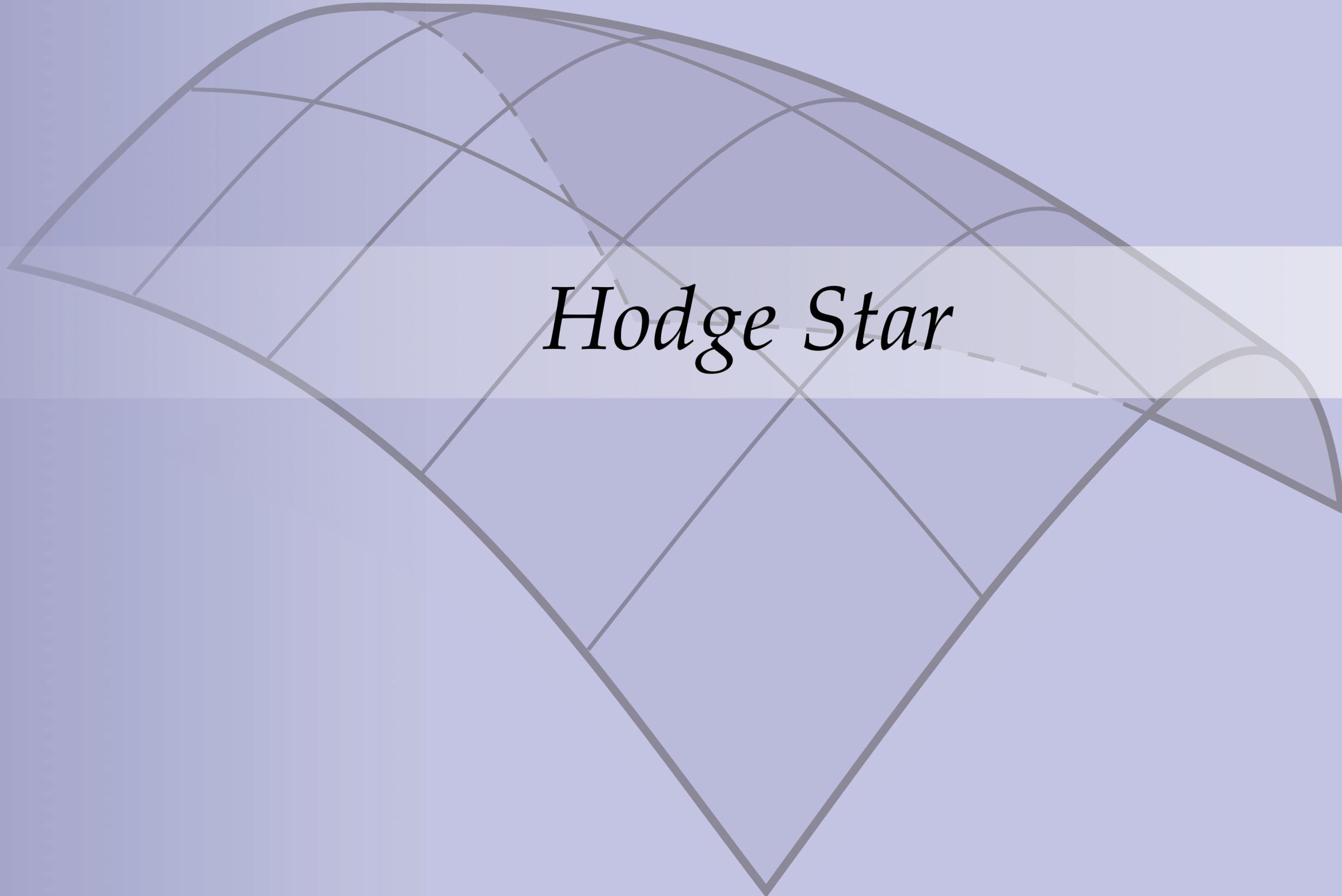
# *0-vectors as Scalars*

**Q:** What do you get when you wedge *zero* vectors together?

**A:** You get this:

For convenience, however, we will say that a “0-vector” is a *scalar value* (e.g., a real number). This treatment becomes extremely useful later on...

**Key idea:** *magnitude*, but no *direction* (scalar).



*Hodge Star*

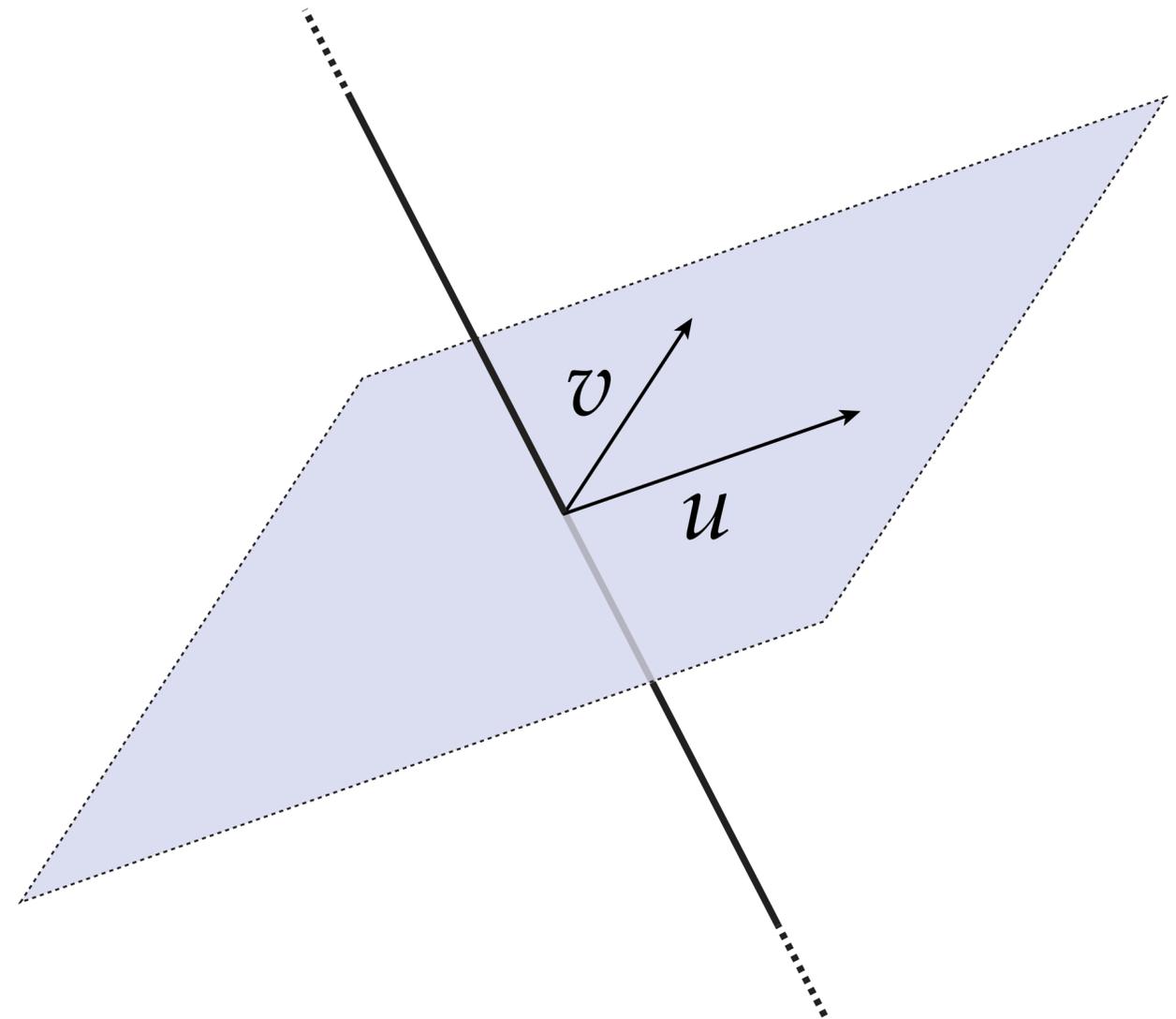
# Review: Orthogonal Complement

**Q:** Geometrically, what is the *orthogonal complement* of a linear subspace?

**Example:** *orthogonal complement of a span*

$$V := \text{span}(\{u, v\})$$

$$V^\perp := \{x \in \mathbb{R}^n \mid \langle x, w \rangle = 0 \ \forall w \in V\}$$



**Notice:** orthogonal complement meaningful only if we have an *inner product*!

# Orthogonal Complement

**Definition:** Let  $U \subseteq V$  be a linear subspace of a vector space  $V$  with an inner product  $\langle \cdot, \cdot \rangle$ . The *orthogonal complement* of  $U$  is the collection of vectors

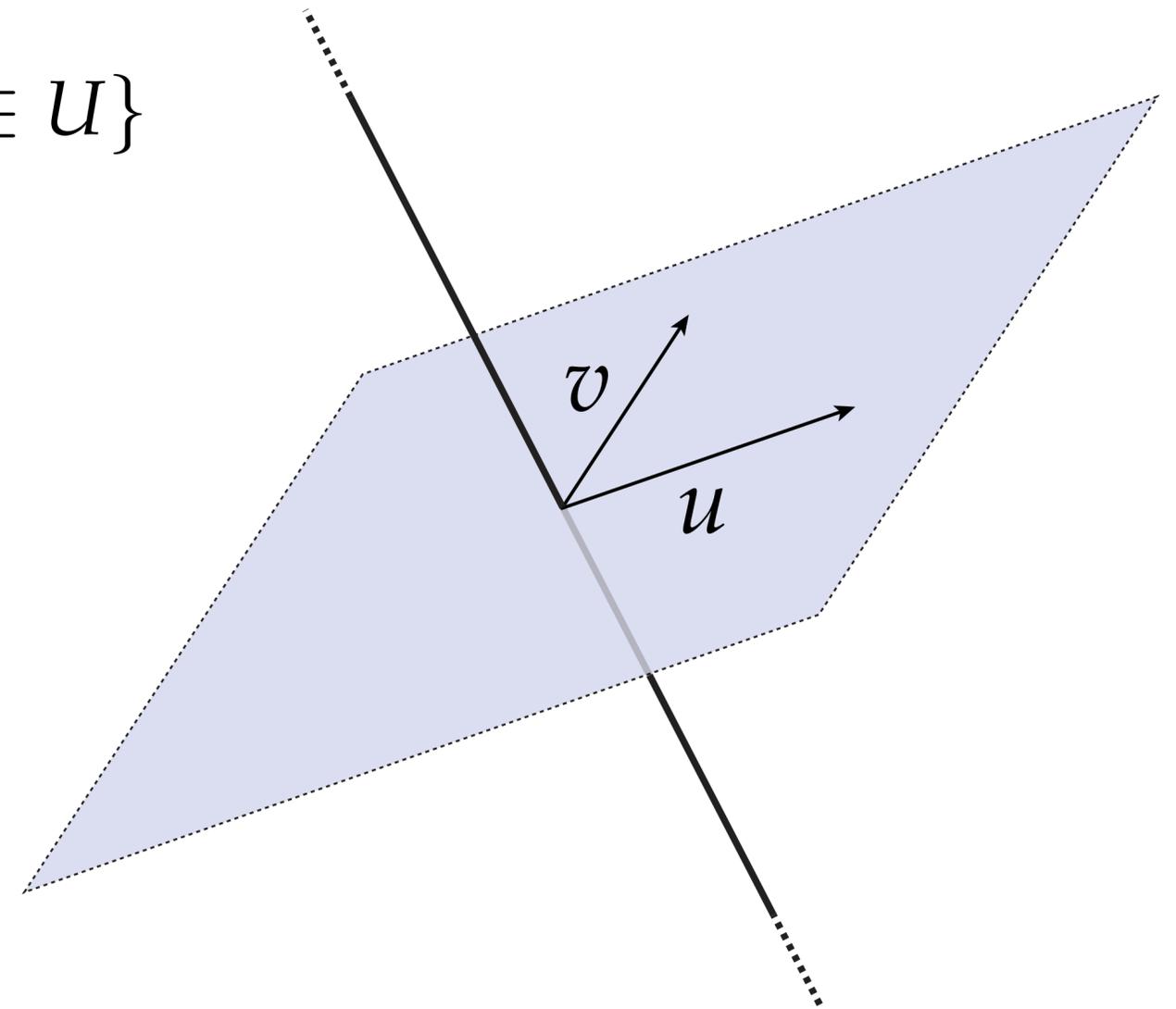
$$U^\perp := \{v \in V \mid \langle u, v \rangle = 0, \forall u \in U\}$$

(**Note:** depends on choice of inner product!)

**Example.** “What kind of cuisine do you like?”

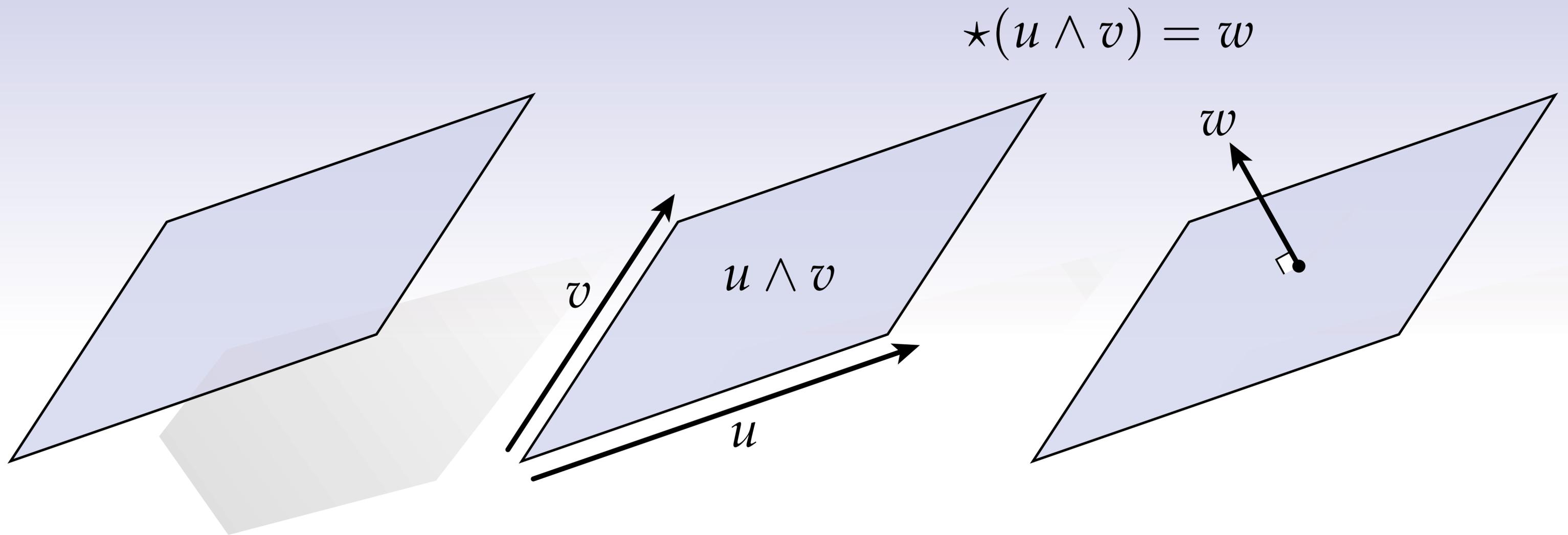
*Option 1:* “I like Vietnamese, Italian, Ethiopian, ...”

*Option 2:* “I like everything but Bavarian food!”



**Key idea:** often it's easier to specify a set by saying what it *doesn't* contain.

# Hodge Star ( $\star$ )



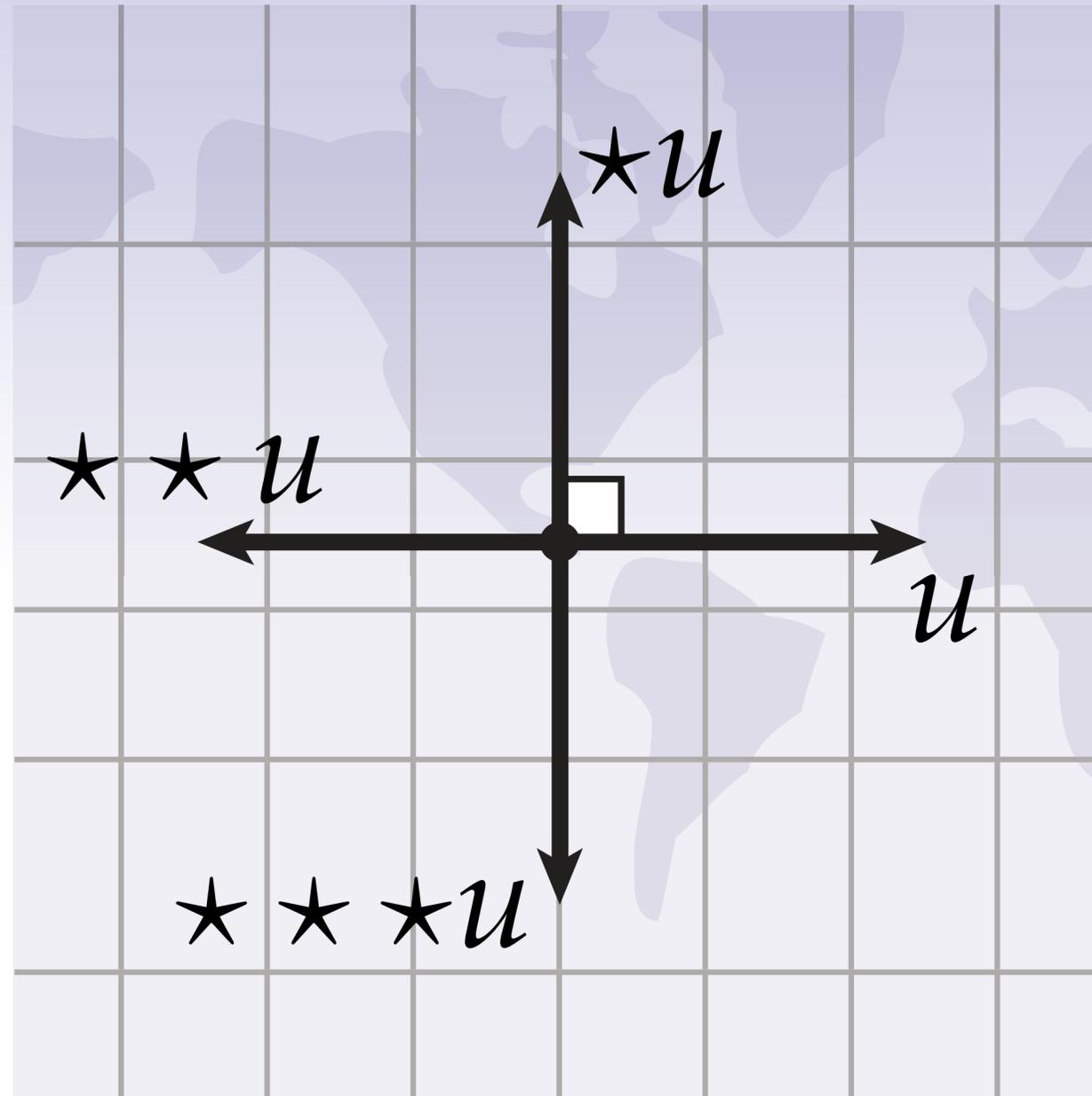
**Analogy:** *orthogonal complement*

**Key differences:** orientation & magnitude

**Small detail:**  $z \wedge \star z$  is *positively oriented*

$$k \mapsto (n - k)$$

# *Hodge Star - 2D*

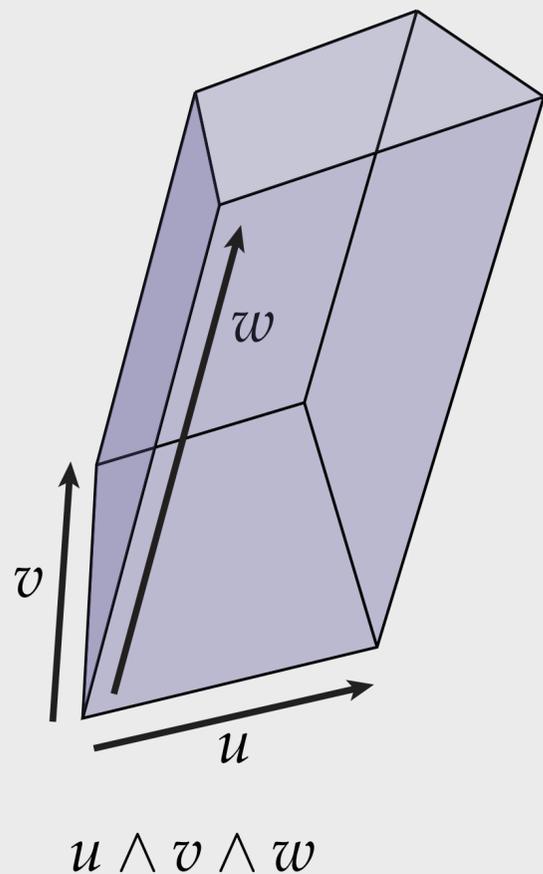


*Analogy: 90-degree rotation*

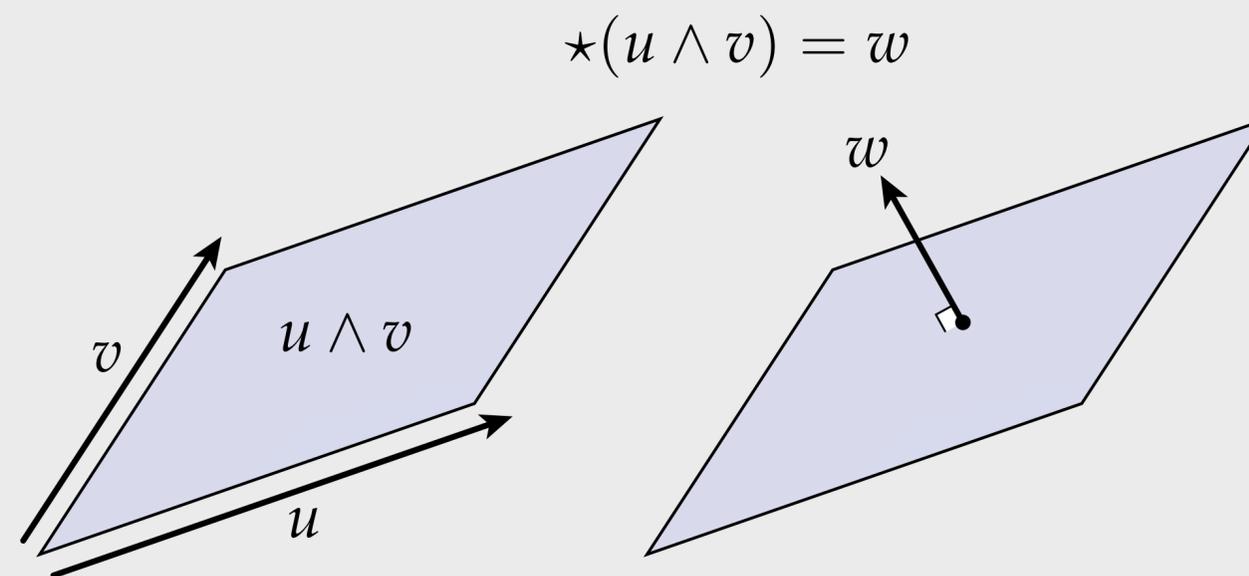
# Exterior Algebra—Recap

Let  $V$  be an  $n$ -dimensional vector space, consisting of vectors or  $1$ -vectors.

Can “wedge together”  $k$  vectors to get a  $k$ -vector (signed volume).



Can apply the Hodge star to get the “complementary”  $k$ -vector.



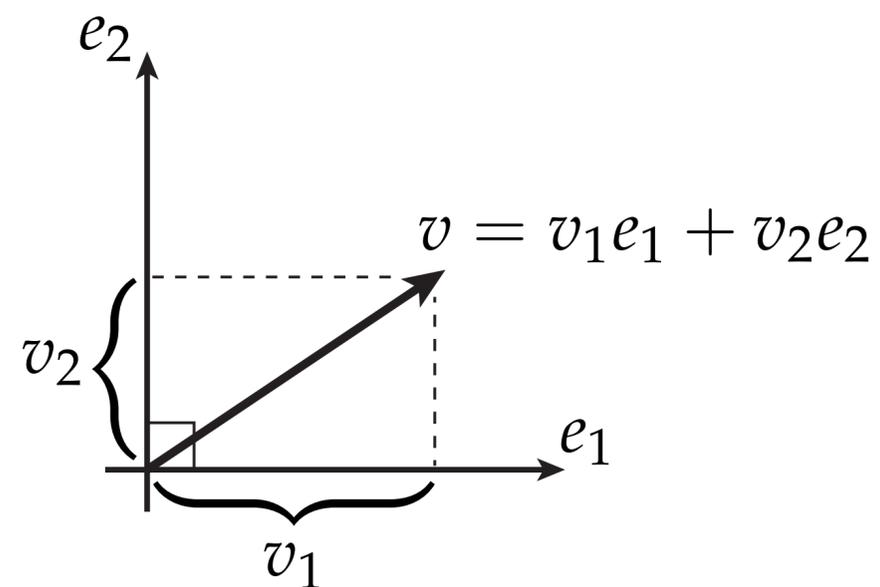
(Also have the usual vector space operations: sum, scalar multiplication, ...)

# Basis

**Definition.** Let  $V$  be a vector space. A collection of vectors is *linearly independent* if no vector in the collection can be expressed as a linear combination of the others. A linearly independent collection of vectors  $\{e_1, \dots, e_n\}$  is a *basis* for  $V$  if every vector  $v \in V$  can be expressed as

$$v = v_1 e_1 + \dots + v_n e_n$$

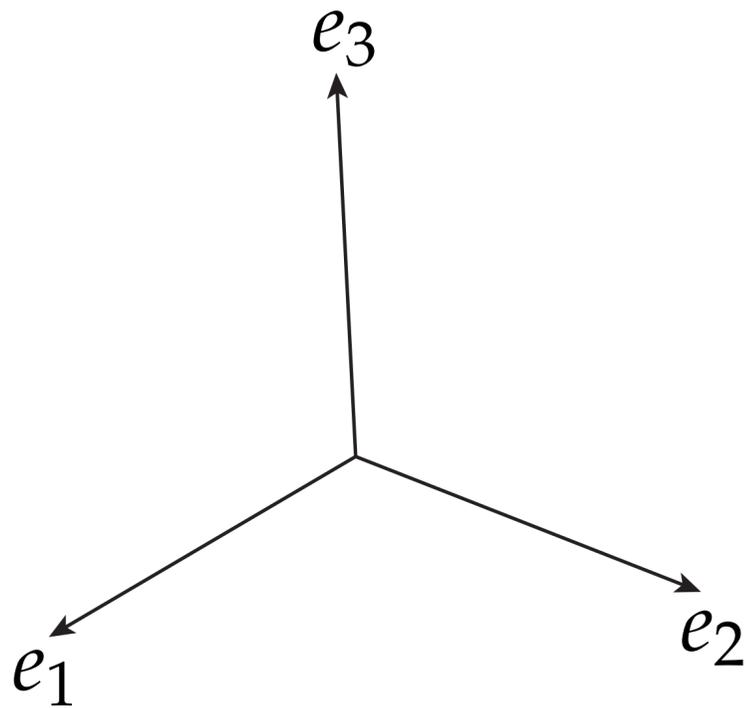
for some collection of coefficients  $v_1, \dots, v_n \in \mathbb{R}$ , i.e., if every vector can be uniquely expressed as a linear combination of the *basis vectors*  $e_i$ . In this case, we say that  $V$  is *finite dimensional*, with dimension  $n$ .



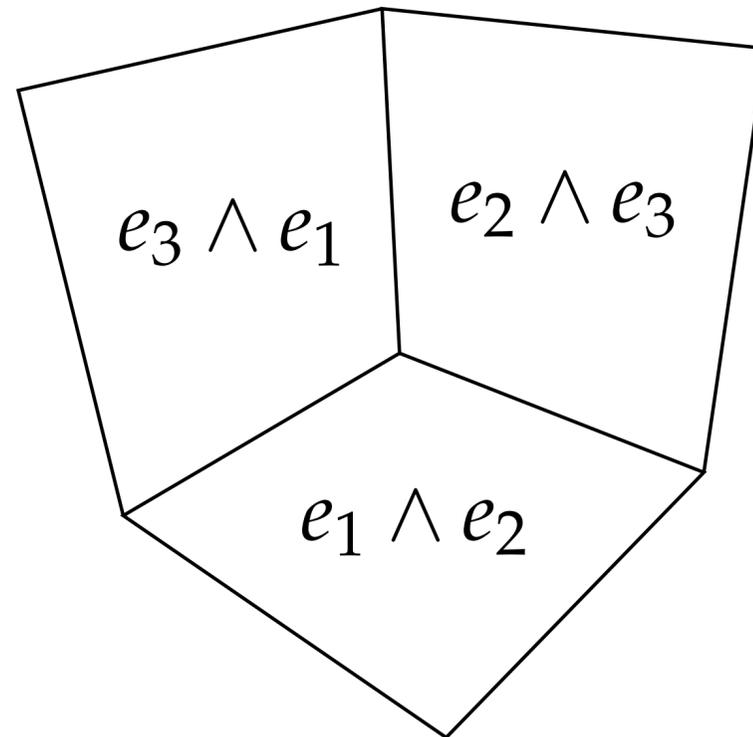
# Basis $k$ -Vectors — Visualized

$$(V = \mathbb{R}^3)$$

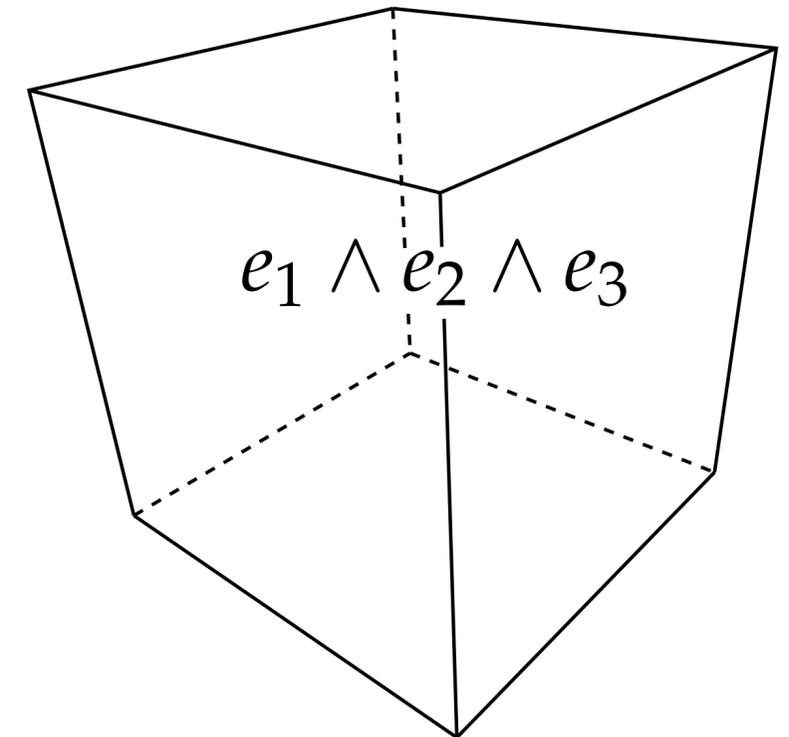
**basis 1-vectors**



**basis 2-vectors**



**basis 3-vectors**



**Key idea:** signed volumes can be expressed as linear combinations of “basis volumes” or basis  $k$ -vectors.

# Basis $k$ -Vectors — How Many?

Consider  $V = \mathbb{R}^4$  with basis  $\{e_1, e_2, e_3, e_4\}$ .

**Q:** How many basis 2-vectors?

$$\begin{array}{l} e_1 \wedge e_2 \\ e_1 \wedge e_3 \quad e_2 \wedge e_3 \\ e_1 \wedge e_4 \quad e_2 \wedge e_4 \quad e_3 \wedge e_4 \end{array}$$

**Q:** How many basis 3-vectors?

$$\begin{array}{l} e_1 \wedge e_2 \wedge e_3 \\ e_1 \wedge e_2 \wedge e_4 \\ e_1 \wedge e_3 \wedge e_4 \\ e_2 \wedge e_3 \wedge e_4 \end{array}$$

Why not  $e_3 \wedge e_2$ ?  $e_4 \wedge e_4$ ?

*What do these bases represent geometrically?*

**Q:** How many basis 4-vectors?

$$e_1 \wedge e_2 \wedge e_3 \wedge e_4$$

**Q:** How many basis 1-vectors?

**Q:** How many basis 0-vectors?

**Q:** Notice a pattern?

$\mathbb{R}^3$	$\mathbb{R}^4$
1	1
3	4
3	6
1	4
	1

# Hodge Star — Basis $k$ -Vectors

Consider  $V = \mathbb{R}^3$  with orthonormal basis  $\{e_1, e_2, e_3\}$

**Q:** How does the Hodge star map basis  $k$ -vectors to basis  $(n - k)$ -vectors ( $n=3$ )?

**A:** *Defining* property of Hodge star—for any  $k$ -vector  $\alpha := e_{i_1} \wedge \cdots \wedge e_{i_k}$ , must have  $\det(\alpha \wedge \star\alpha) = 1$ , i.e., if we start with a “unit volume,” wedge with its Hodge star must also be a unit, positively-oriented volume. For example:

Given  $\alpha := e_2$ , find  $\star\alpha$  such that  $\det(e_2 \wedge \star e_2) = 1$ .

$\Rightarrow$  Must have  $\star\alpha = e_3 \wedge e_1$ , since then

$$e_2 \wedge \star e_2 = e_2 \wedge e_3 \wedge e_1,$$

which is an even permutation of  $e_1 \wedge e_2 \wedge e_3$ .

$$\begin{aligned}\star 1 &= e_1 \wedge e_2 \wedge e_3 \\ \star e_1 &= e_2 \wedge e_3 \\ \star e_2 &= e_3 \wedge e_1 \\ \star e_3 &= e_1 \wedge e_2 \\ \star(e_2 \wedge e_3) &= e_1 \\ \star(e_3 \wedge e_1) &= e_2 \\ \star(e_1 \wedge e_2) &= e_3 \\ \star(e_1 \wedge e_2 \wedge e_3) &= 1\end{aligned}$$

# Exterior Algebra—Formal Definition

**Definition.** Let  $e_1, \dots, e_n$  be the basis for an  $n$ -dimensional inner product space  $V$ . For each integer  $0 \leq k \leq n$ , let  $\Lambda^k$  denote an  $\binom{n}{k}$ -dimensional vector space with basis elements denoted by  $e_{i_1} \wedge \dots \wedge e_{i_k}$  for all possible sequences of indices  $1 \leq i_1 < \dots < i_k \leq n$ , corresponding to all possible “axis-aligned”  $k$ -dimensional volumes. Elements of  $\Lambda^k$  are called  $k$ -vectors. The *wedge product* is a bilinear map

$$\wedge_{k,l} : \Lambda^k \times \Lambda^l \rightarrow \Lambda^{k+l}$$

uniquely determined by its action on basis elements; in particular, for any collection of *distinct* indices  $i_1, \dots, i_{k+l}$ ,

$$(e_{i_1} \wedge \dots \wedge e_{i_k}) \wedge_{k,l} (e_{i_{k+1}} \wedge \dots \wedge e_{i_{k+l}}) := \text{sgn}(\sigma) e_{\sigma(i_1)} \wedge \dots \wedge e_{\sigma(i_{k+l})},$$

where  $\sigma$  is a permutation that puts the indices of the two arguments in canonical (lexicographic) order. Arguments with repeated indices are mapped to  $0 \in \Lambda^{k+l}$ . For brevity, one typically drops the subscript on  $\wedge_{k,l}$ . Finally, the *Hodge star on  $k$ -vectors* is a linear isomorphism

$$\star : \Lambda^k \rightarrow \Lambda^{n-k}$$

uniquely determined by the relationship

$$\det(\alpha \wedge \star \alpha) = 1$$

where  $\alpha$  is any  $k$ -vector of the form  $\alpha = e_{i_1} \wedge \dots \wedge e_{i_k}$  and  $\det$  denotes the determinant of the constituent 1-vectors (treated as column vectors) with respect to the inner product on  $V$ . The collection of vector spaces  $\Lambda^k$  together with the maps  $\wedge$  and  $\star$  define an *exterior algebra* on  $V$ , sometimes known as a *graded algebra*.

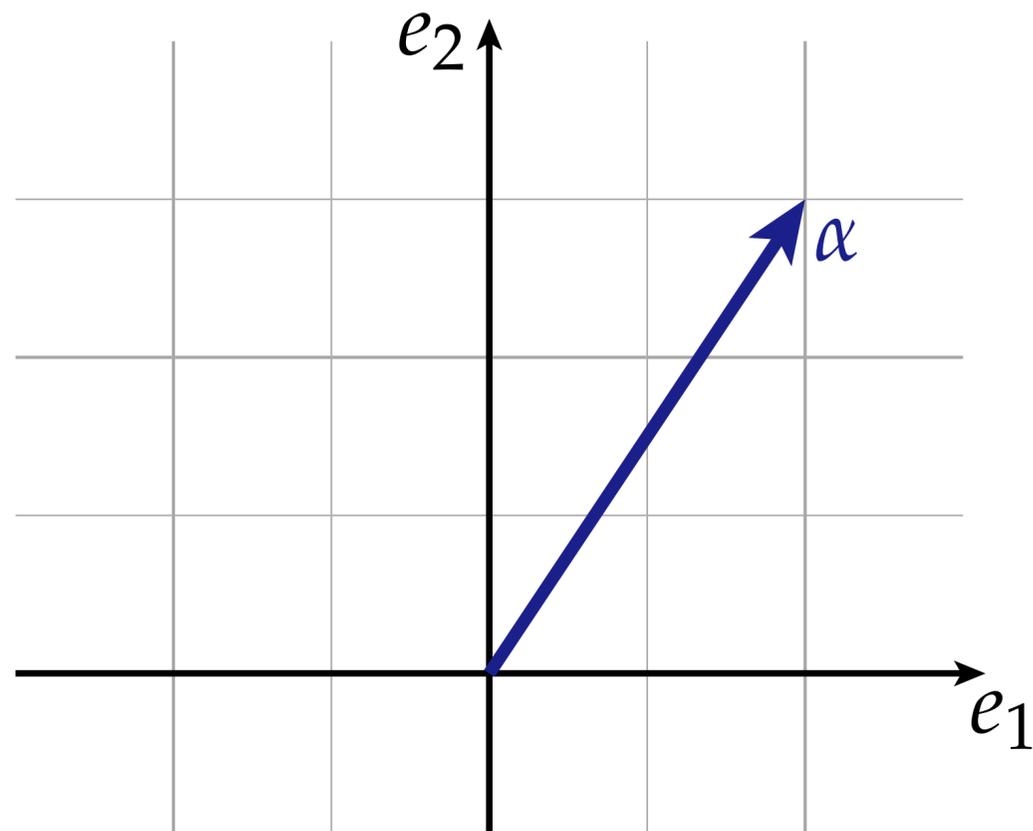
**(...don't worry too much about this!)**

# Sanity Check

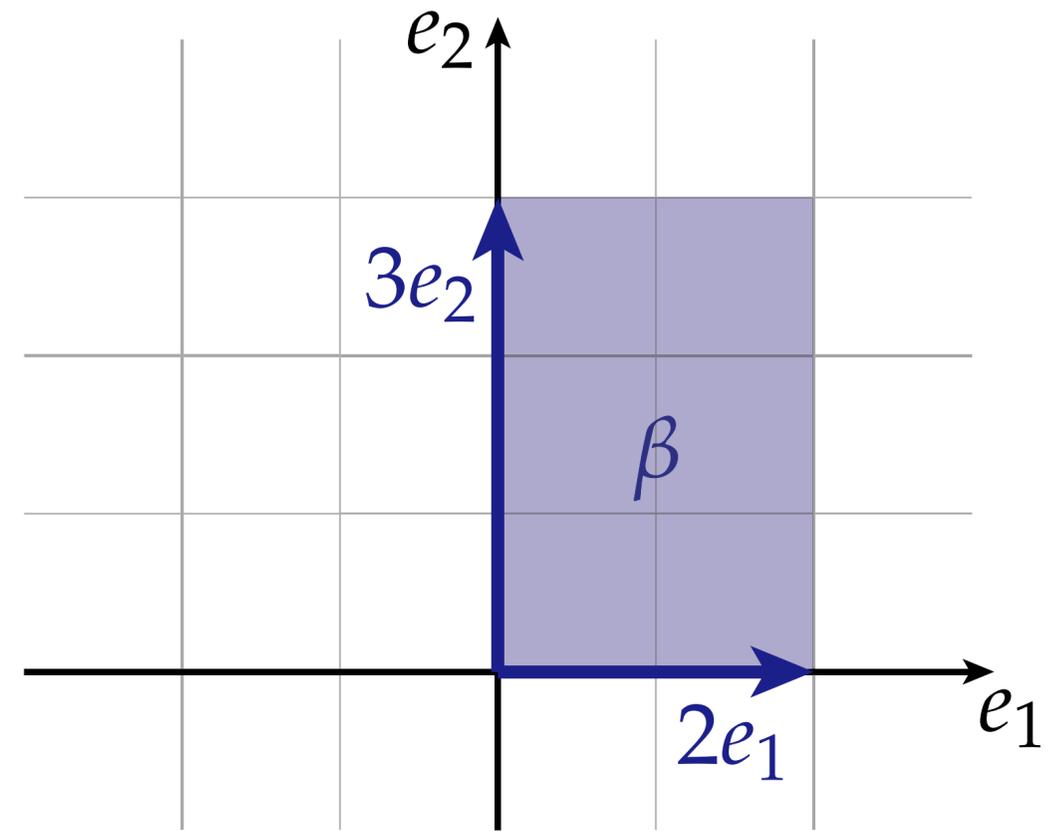
Q: What's the difference between

$$\alpha = 2e_1 + 3e_2 \quad \text{and} \quad \beta = 2e_1 \wedge 3e_2?$$

A:



(vector)



(2-vector)

# Exterior Algebra—Example

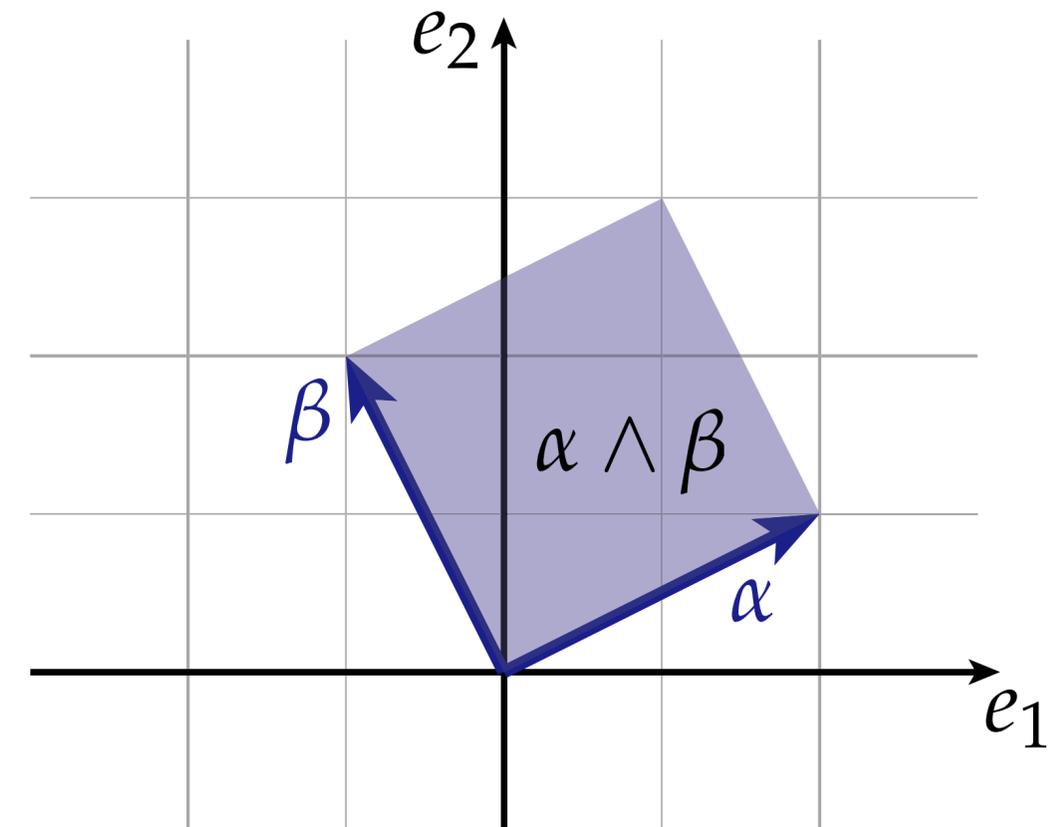
$$V = \mathbb{R}^2$$

$$\alpha = 2e_1 + e_2$$

$$\beta = -e_1 + 2e_2$$

**Q:** What is the value of  $\alpha \wedge \beta$ ?

$$\begin{aligned} \mathbf{A:} \quad \alpha \wedge \beta &= (2e_1 + e_2) \wedge (-e_1 + 2e_2) \\ &= (2e_1 + e_2) \wedge (-e_1) + (2e_1 + e_2) \wedge (2e_2) \\ &= \cancel{-2e_1 \wedge e_1} \overset{0}{-} e_2 \wedge e_1 + 4e_1 \wedge e_2 + \cancel{2e_2 \wedge e_2} \overset{0}{+} \\ &= e_1 \wedge e_2 + 4e_1 \wedge e_2 \\ &= \boxed{5e_1 \wedge e_2} \end{aligned}$$



**Q:** What does the result *mean*, geometrically?

# Exterior Algebra—Example

$$V = \mathbb{R}^3$$

**Q:** What is  $\star(\alpha \wedge \beta + \beta \wedge \gamma)$ ?

$$\alpha = 2e_1 \wedge e_2$$

$$\beta = 3e_3$$

$$\gamma = e_2 \wedge e_1$$

$$\begin{aligned} \mathbf{A:} \star(\alpha \wedge \beta + \beta \wedge \gamma) &= \star((2e_1 \wedge e_2) \wedge 3e_3 + 3e_3 \wedge (e_2 \wedge e_1)) \\ &= \star(6e_1 \wedge e_2 \wedge e_3 + 3e_3 \wedge e_2 \wedge e_1) \\ &= \star(6e_1 \wedge e_2 \wedge e_3 - 3e_1 \wedge e_2 \wedge e_3) \\ &= \star(3e_1 \wedge e_2 \wedge e_3) \\ &= 3. \end{aligned}$$

**Key idea:** in this example, it would have been fairly hard to reason about the answer geometrically. Sometimes the algebraic approach is (*incredibly!*) useful.

# *Exterior Algebra - Summary*

- **Exterior algebra**

- language for manipulating *signed volumes*

- length matters (magnitude)

- order matters (orientation)

- behaves like a vector space (e.g., can add two volumes, scale a volume, ...)

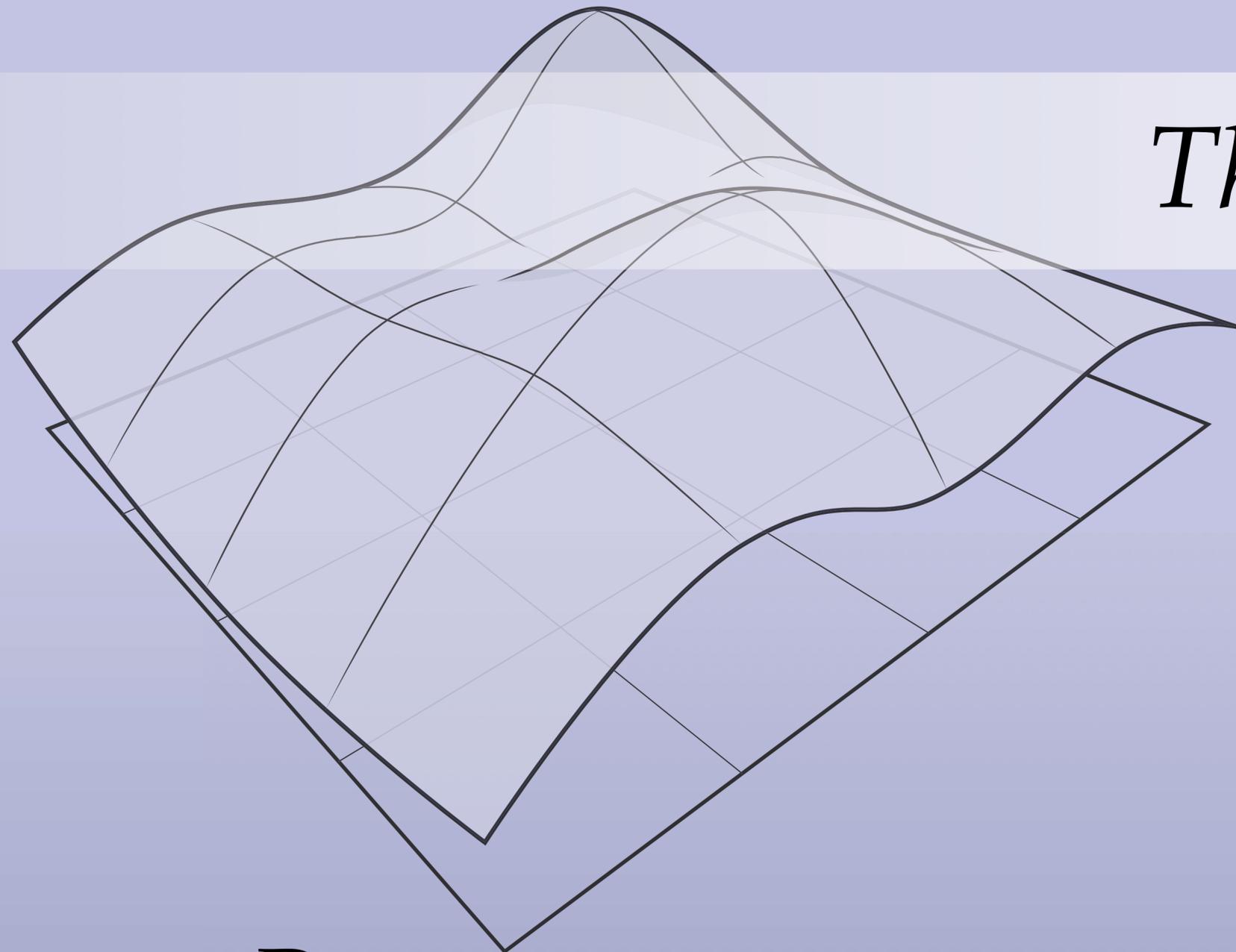
- **Wedge product**—analogous to *span* of vectors

- **Hodge star**—analogous to *orthogonal complement* (in 2D: 90-degree rotation)

- Coordinate representation—encode vectors in a *basis*

- Basis  $k$ -vectors are all possible wedges of basis 1-vectors

*Thanks!*



DISCRETE DIFFERENTIAL  
GEOMETRY:  
AN APPLIED INTRODUCTION

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