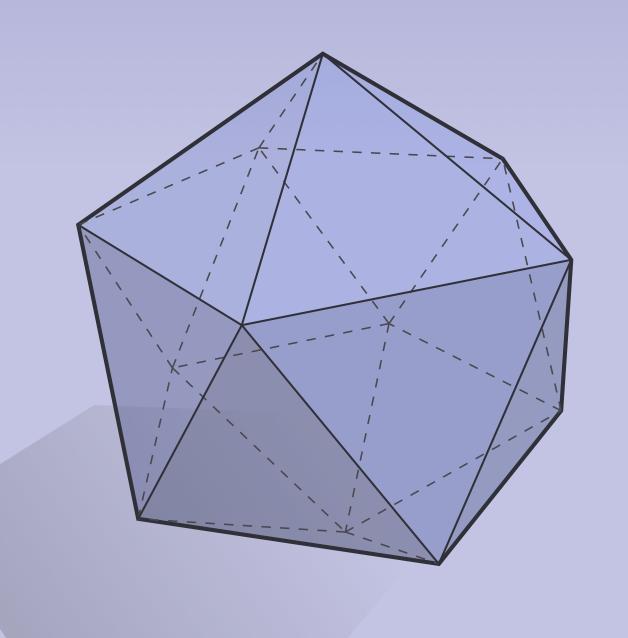


# DISCRETE DIFFERENTIAL GEOMETRY:

### AN APPLIED INTRODUCTION

Keenan Crane • CMU 15-458/858B • Fall 2017

# LECTURE 2: EXTERIOR ALGEBRA



# DISCRETE DIFFERENTIAL GEOMETRY:

### AN APPLIED INTRODUCTION

Keenan Crane • CMU 15-458/858B • Fall 2017

## Where Are We Going Next?

Goal: develop discrete exterior calculus (DEC)

#### Prerequisites:

Linear algebra: "little arrows" (vectors)

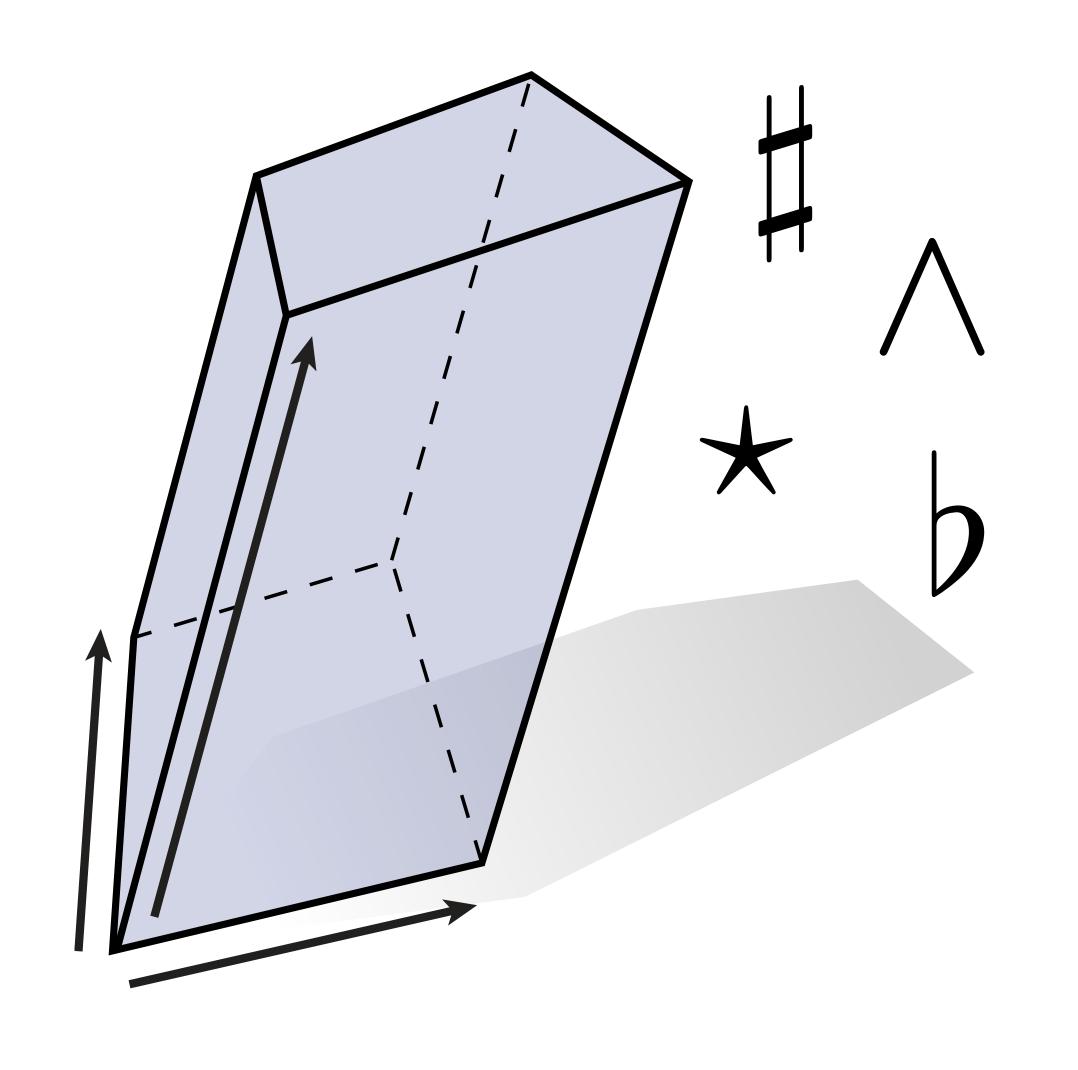
Vector Calculus: how do vectors change?

#### Next few lectures:

Exterior algebra: "little volumes" (*k*-vectors)

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

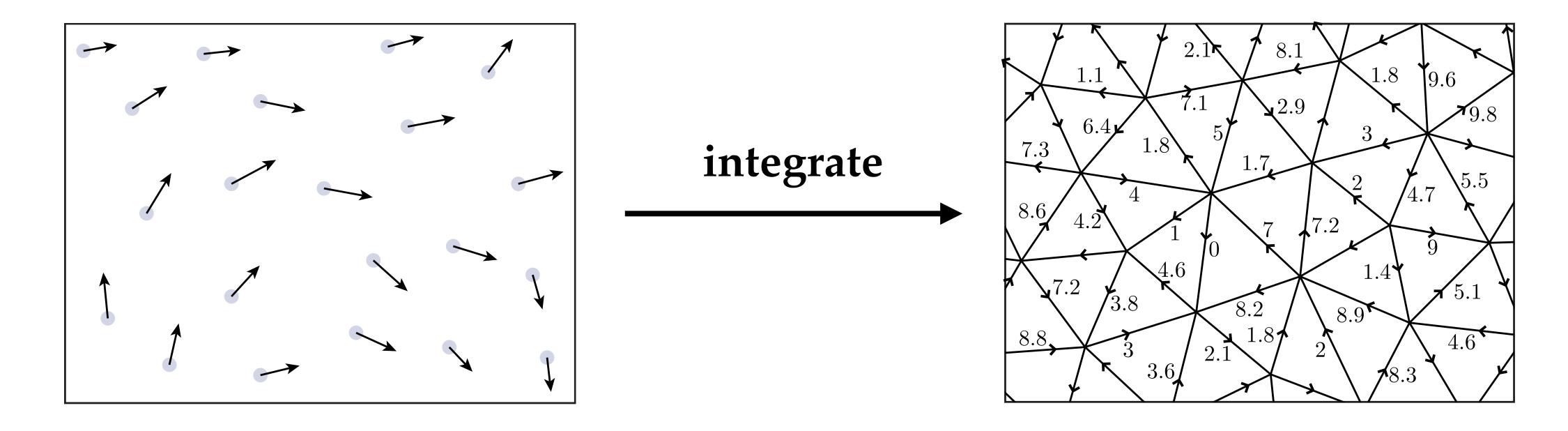
**DEC:** how do we do all of this on meshes?



Basic idea: replace vector calculus with computation on meshes.

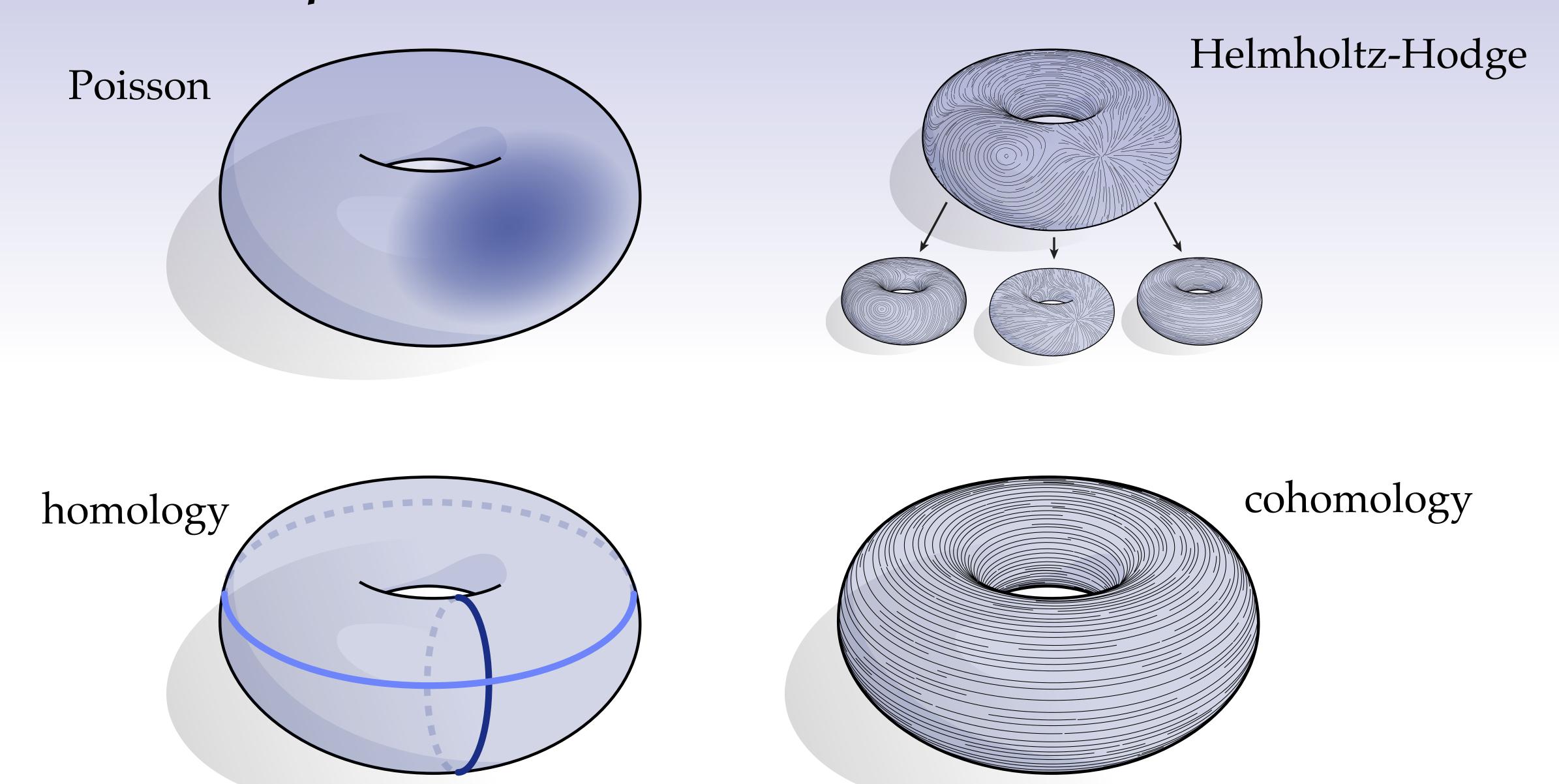
## Why Are We Going There?

• TLDR: So that we can solve equations on meshes!

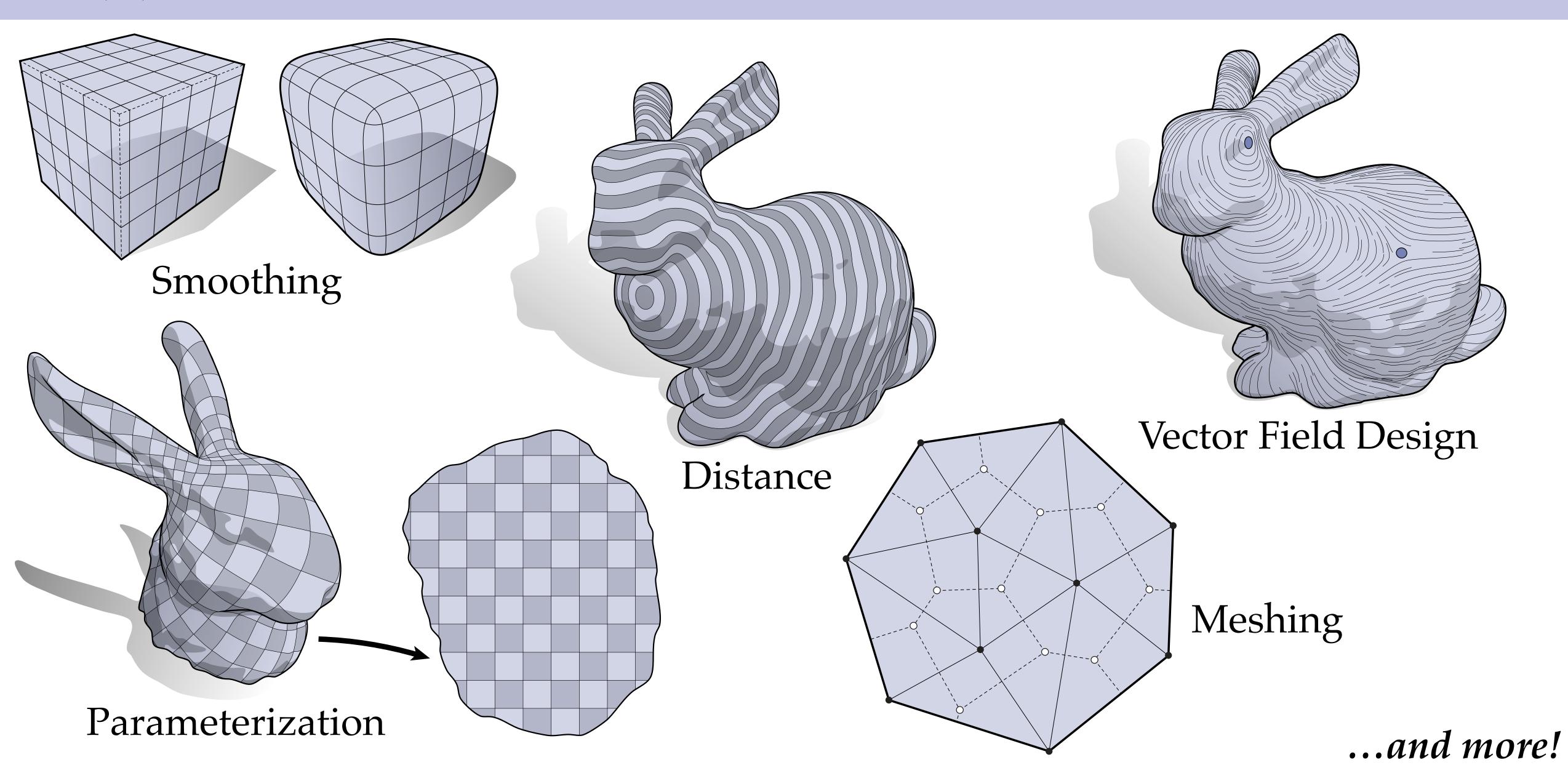


- Geometry processing algorithms solve equations on meshes
- Meshes are made up of little volumes
- ⇒ Need to learn to *integrate equations over little volumes* to do computation!

## Basic Computational Tools



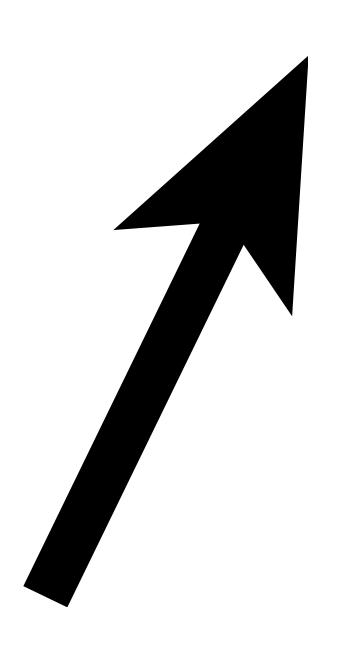
## Applications



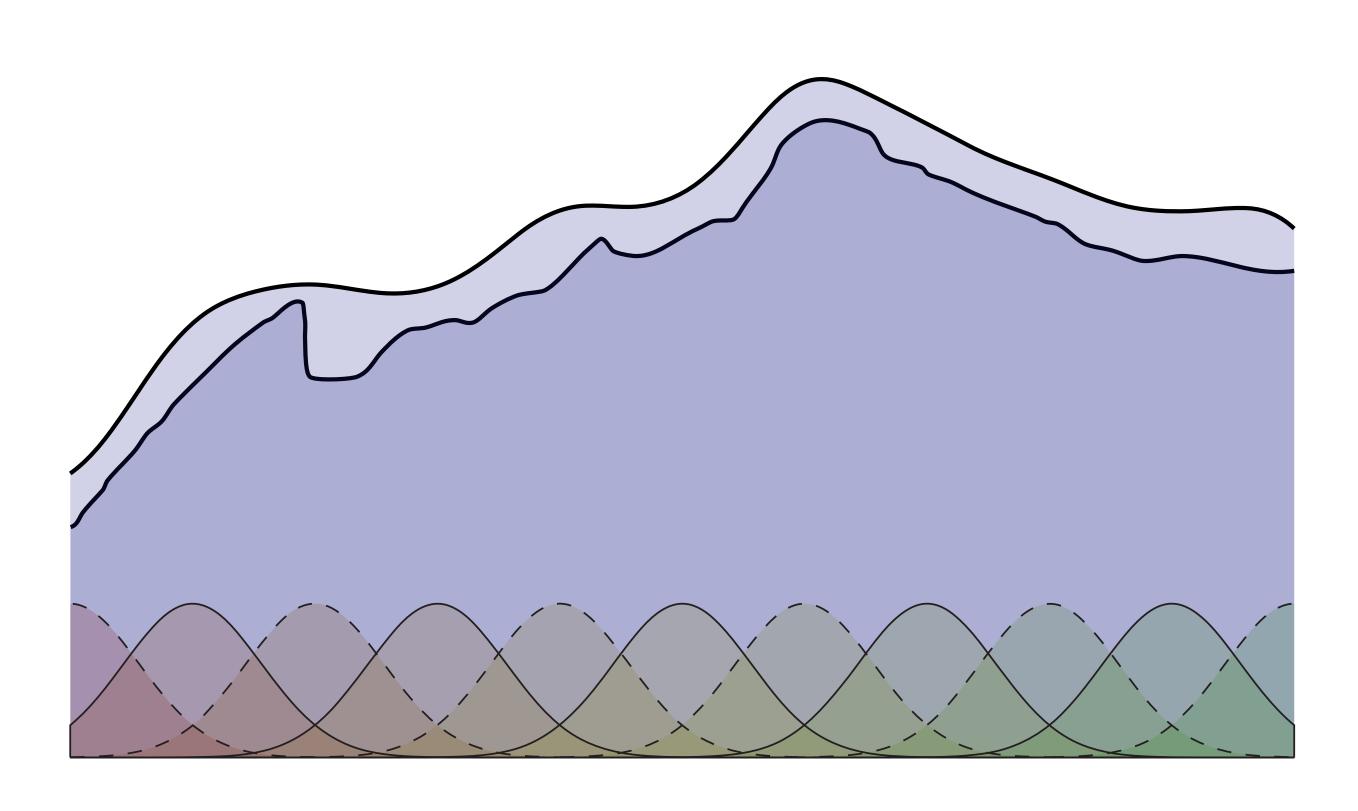


## Review: Vector Spaces

• What is a vector? (Geometrically?)



finite-dimensional



infinite-dimensional

For geometric computing, often care most about dimensions 1, 2, 3, ...and ∞!

## Review: Vector Spaces

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

$$+: V imes V o V$$
 "addition"  $: \mathbb{R} imes V o V$  "scalar multiplication"

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

$$x + y = y + x$$

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

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

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

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

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

$$1x = x$$

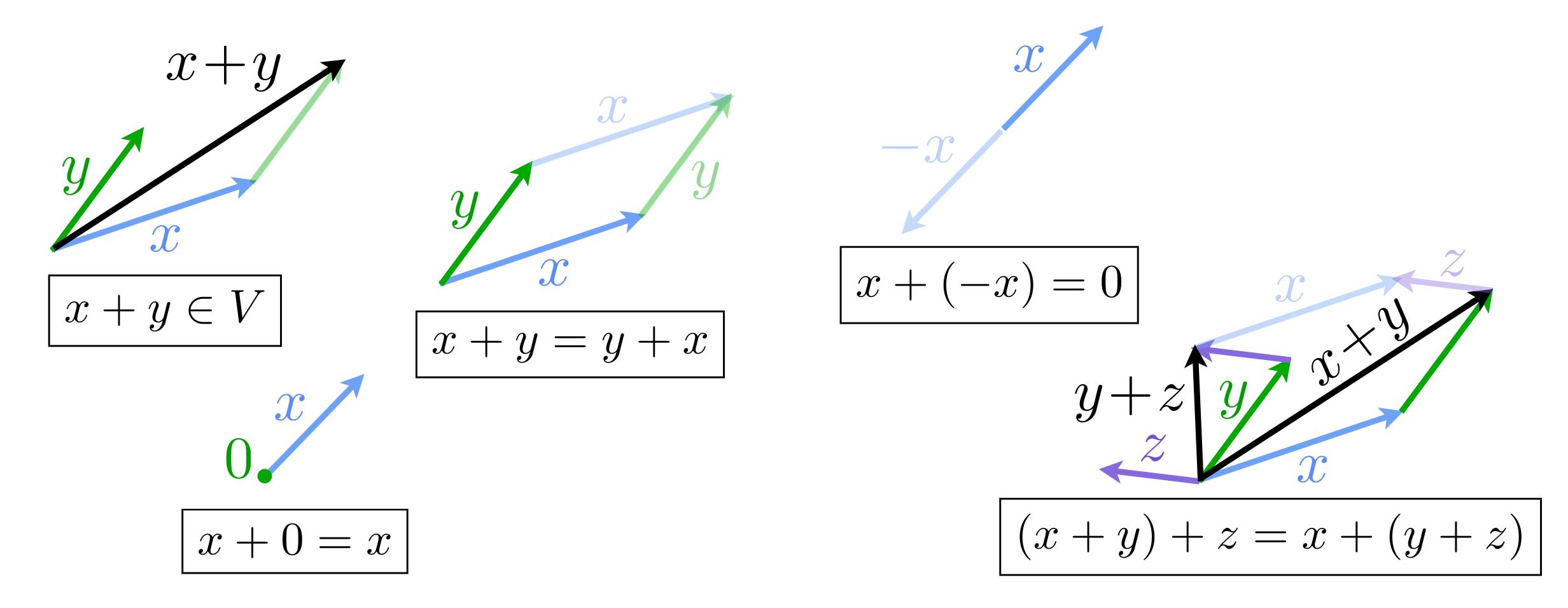
$$a(x + y) = ax + ay$$

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

<sup>\*</sup>Note: in general, could use something other than reals here.

## Vector Spaces—Geometric Reasoning

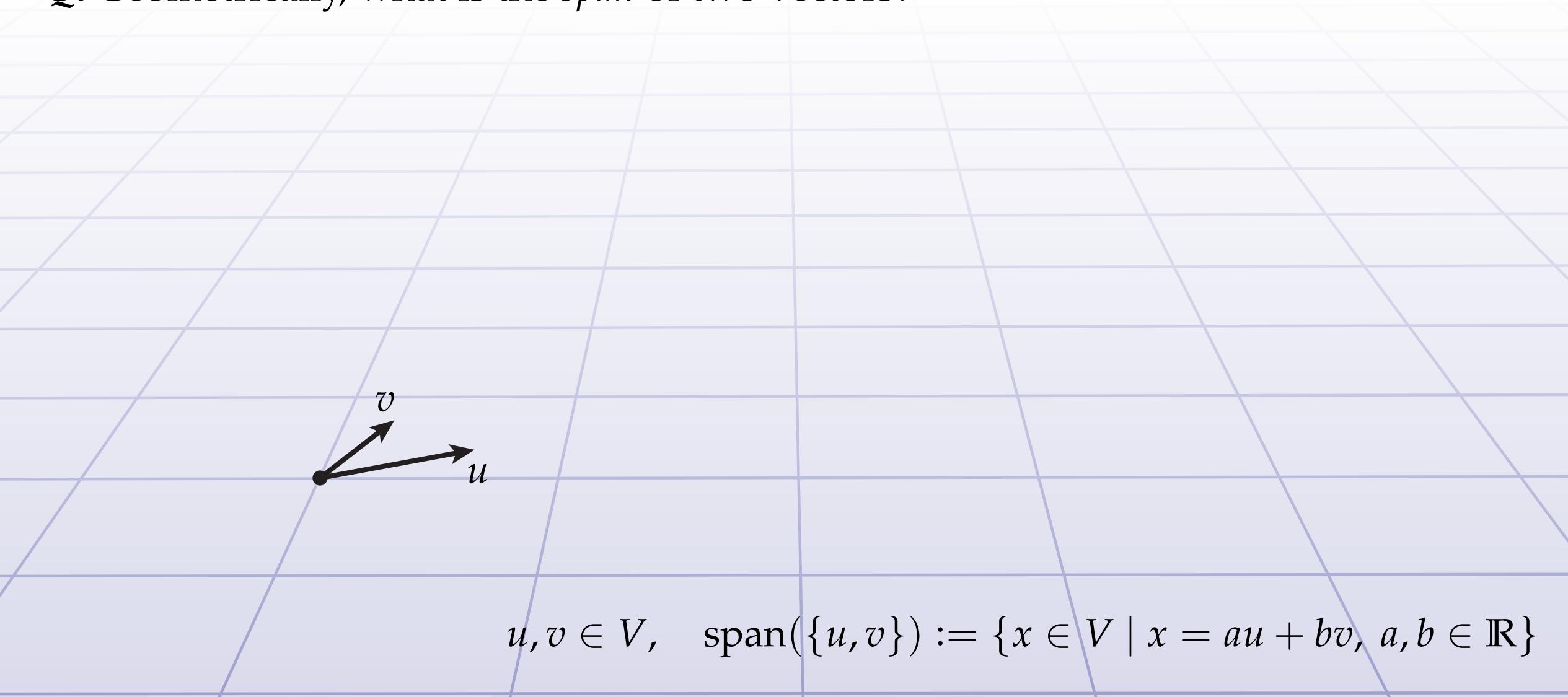
- Where do these rules come from?
- As with numbers, reflect how *oriented lengths* (vectors) behave in nature.



# Wedge Product

## Review: Span

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

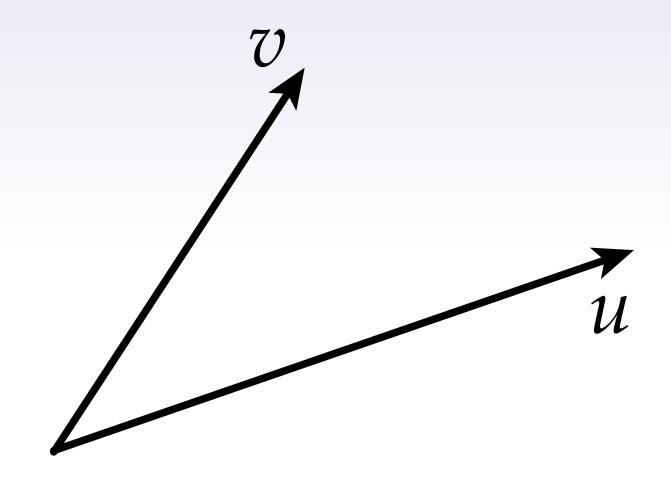


## Span

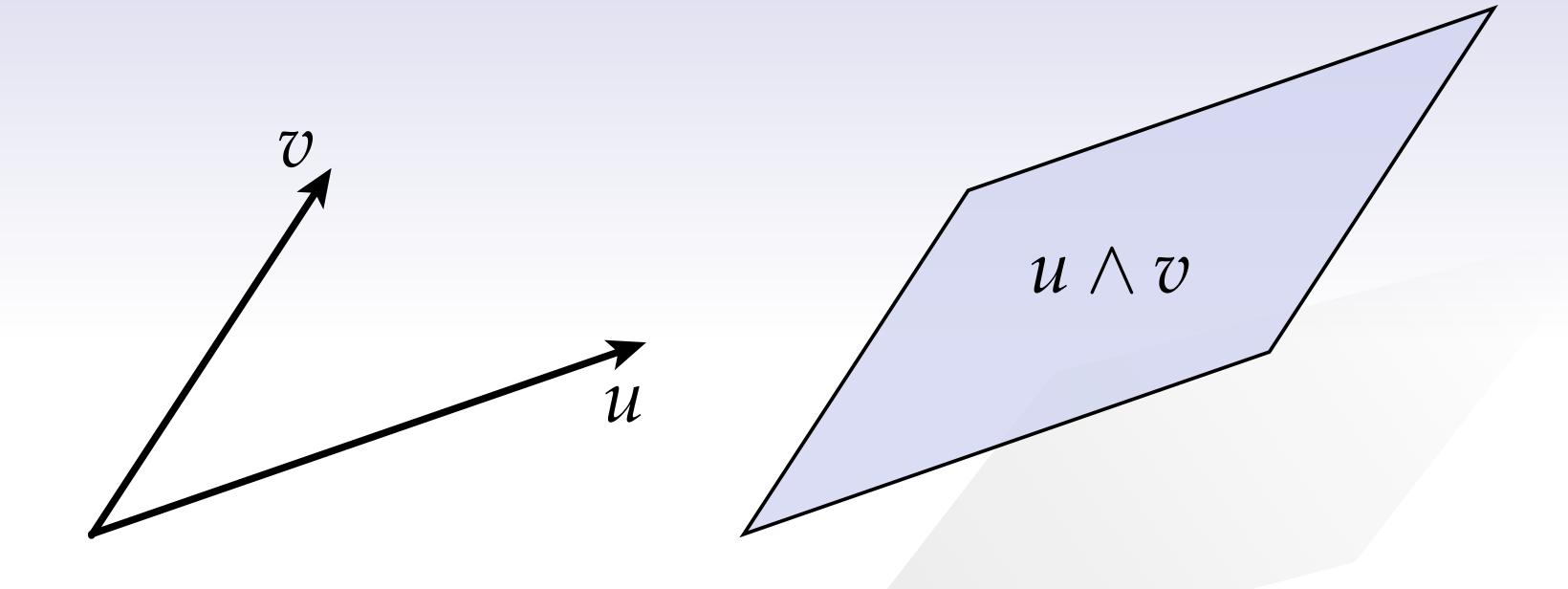
**Definition.** In any vector space V, the *span* of a finite collection of vectors  $\{v_1, \ldots, v_k\}$  is the set of all possible linear combinations

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

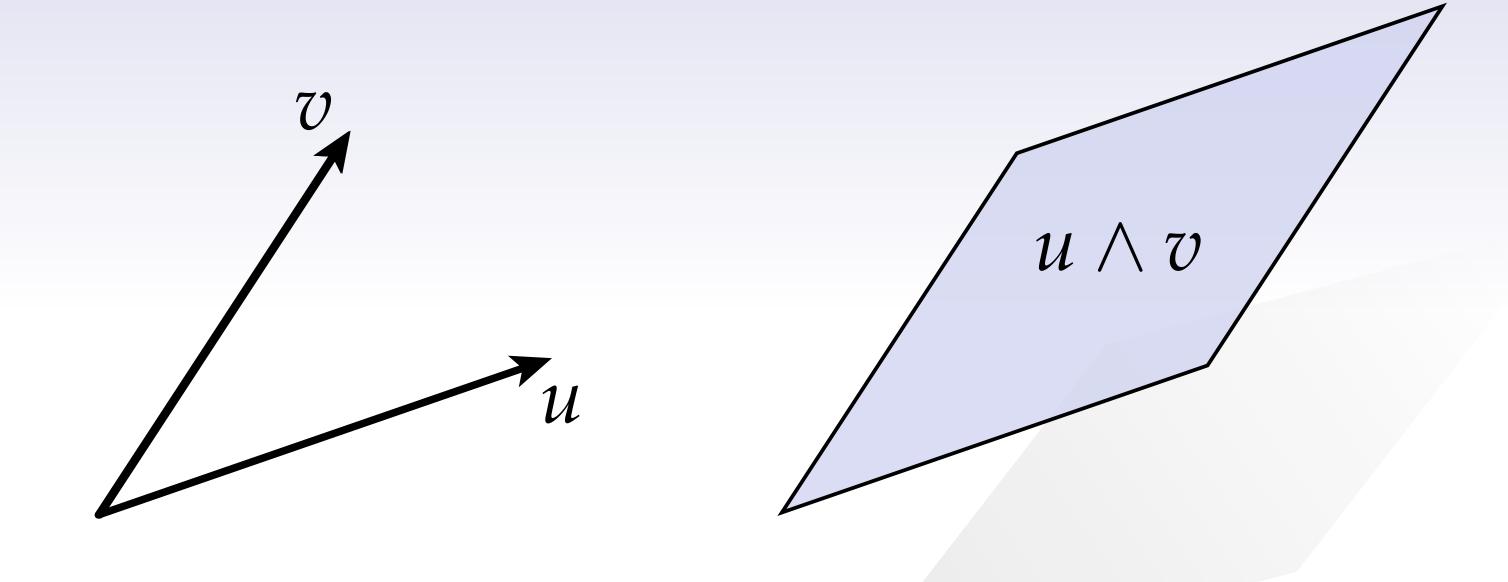
(*Note:* one cannot extend this definition to infinite sums without additional assumptions about V.) The span of a collection of vectors is a *linear subspace*, *i.e.*, a subset that forms a vector space with respect to the original vector space operations.



Analogy: span

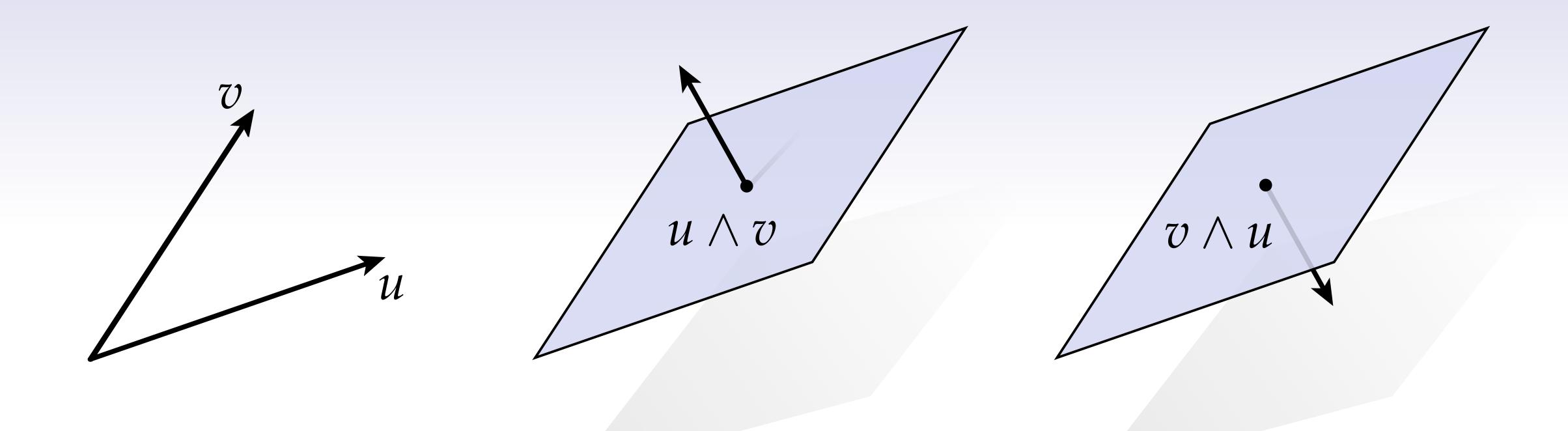


Analogy: span



Analogy: span

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



Analogy: span

Key differences: orientation & "finite extent"

Key property: antisymmetry

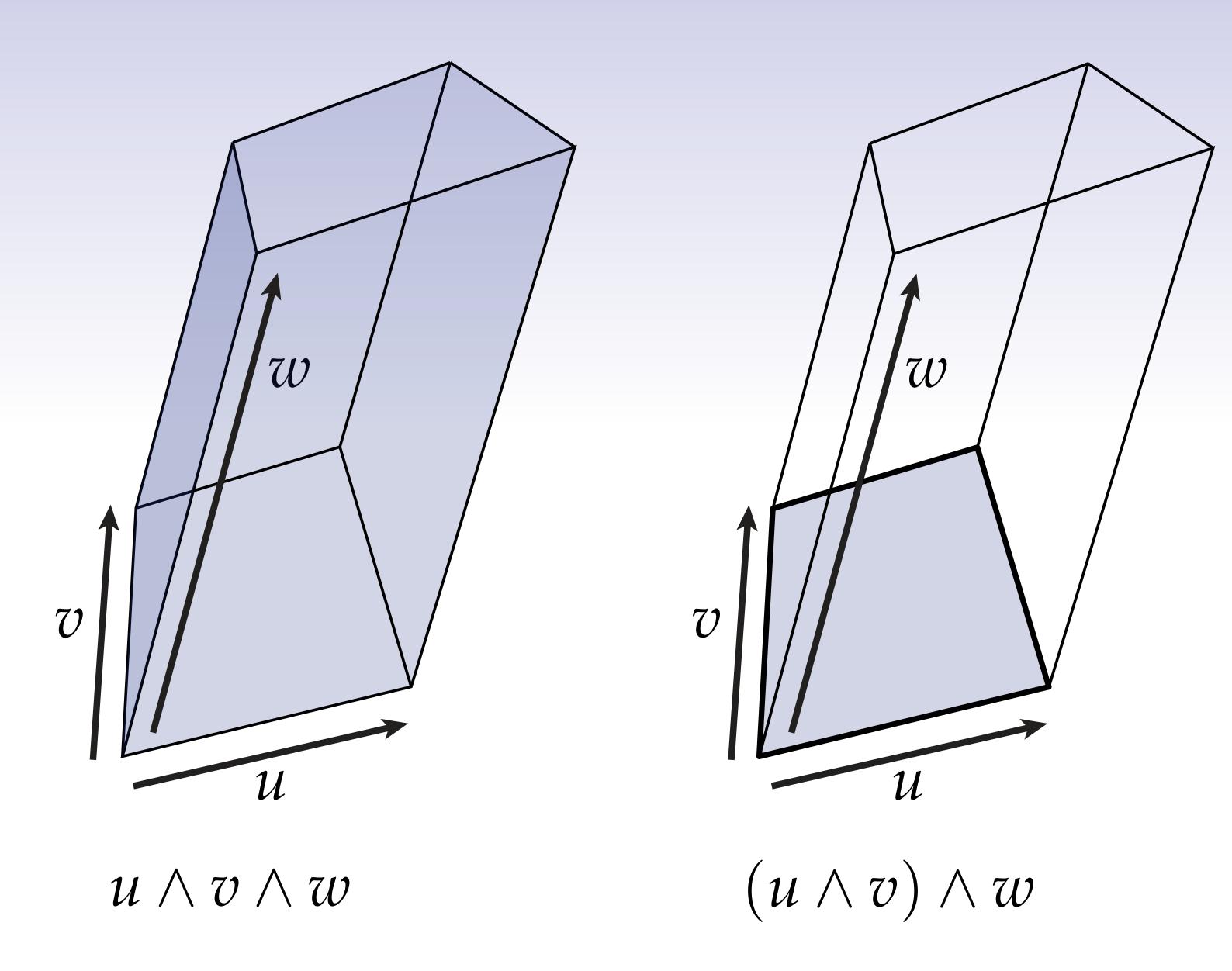
## Wedge Product—Degeneracy

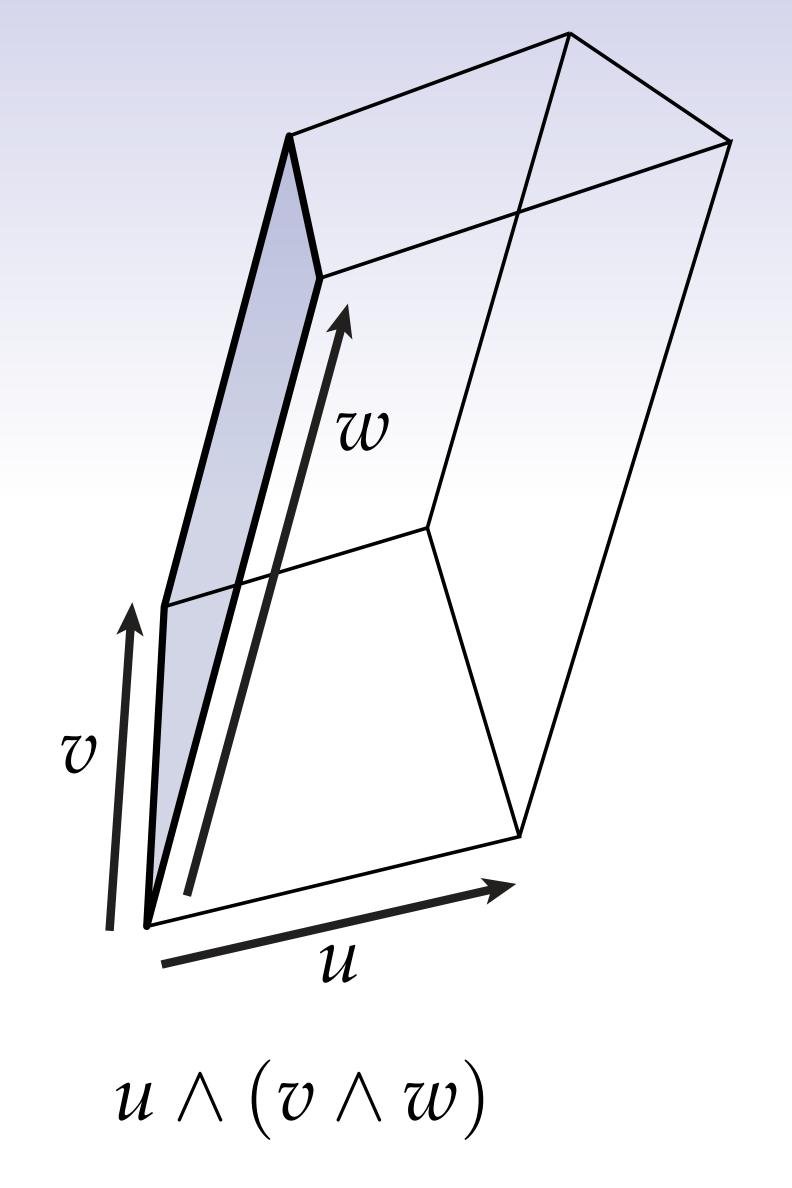
Q: What is the wedge product of a vector with itself?

A: Geometrically, spans a region of zero area.

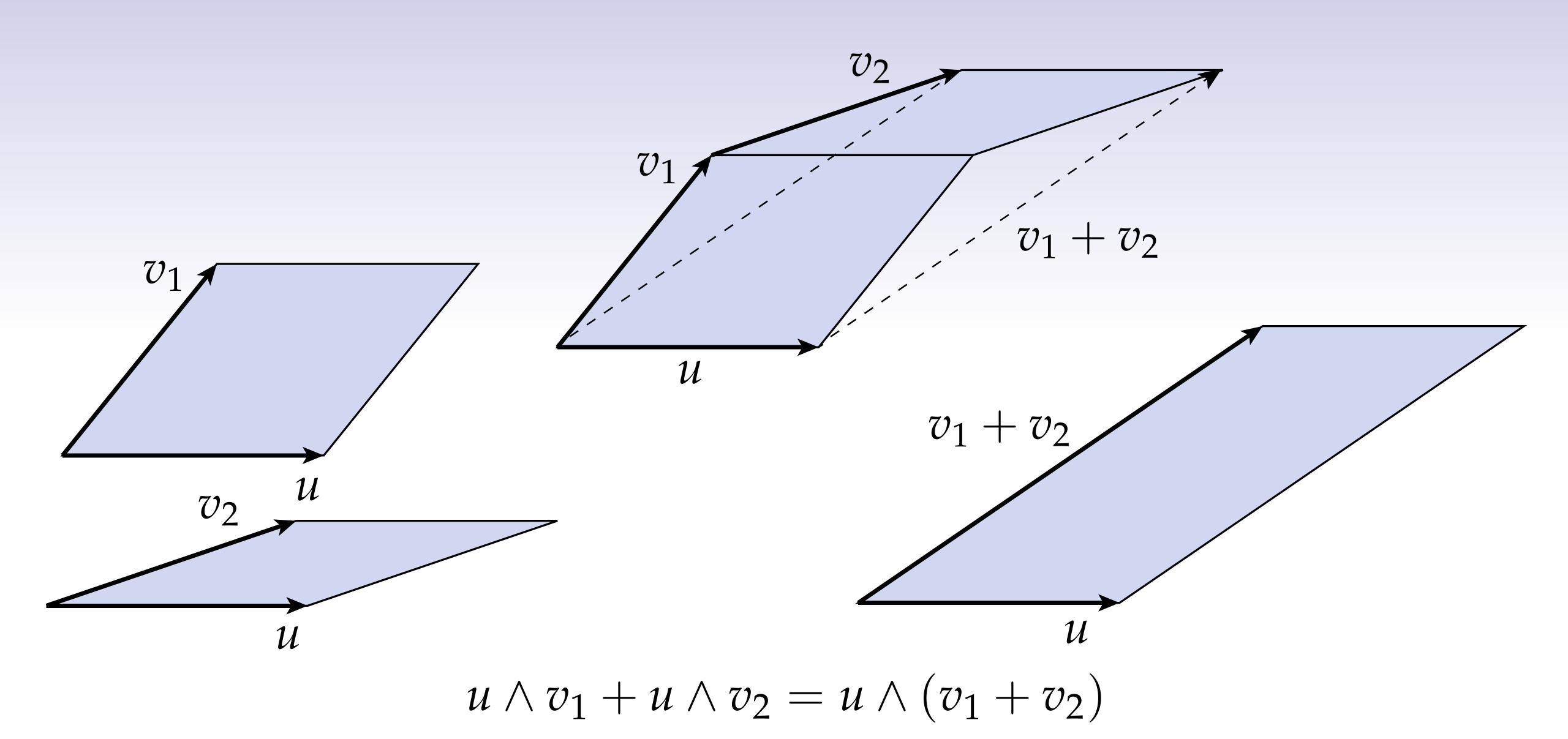
$$u \wedge u = 0$$

## Wedge Product - Associativity



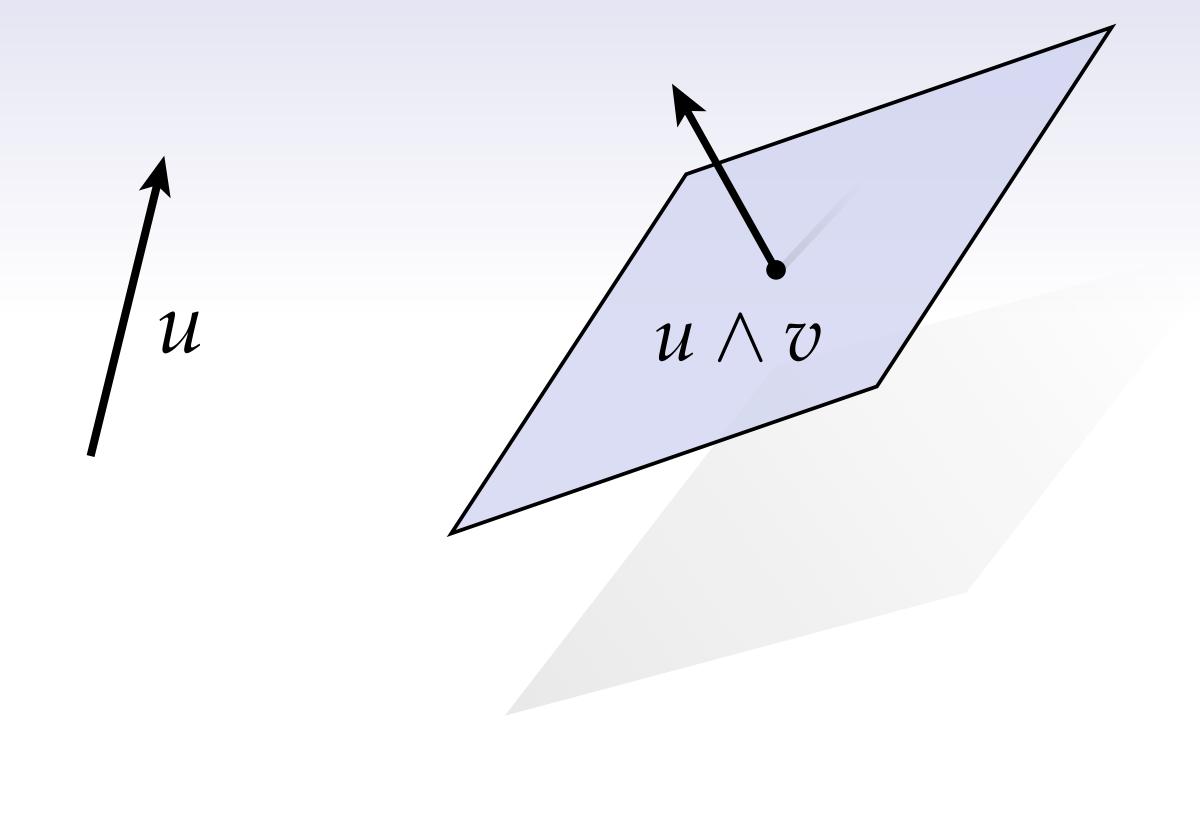


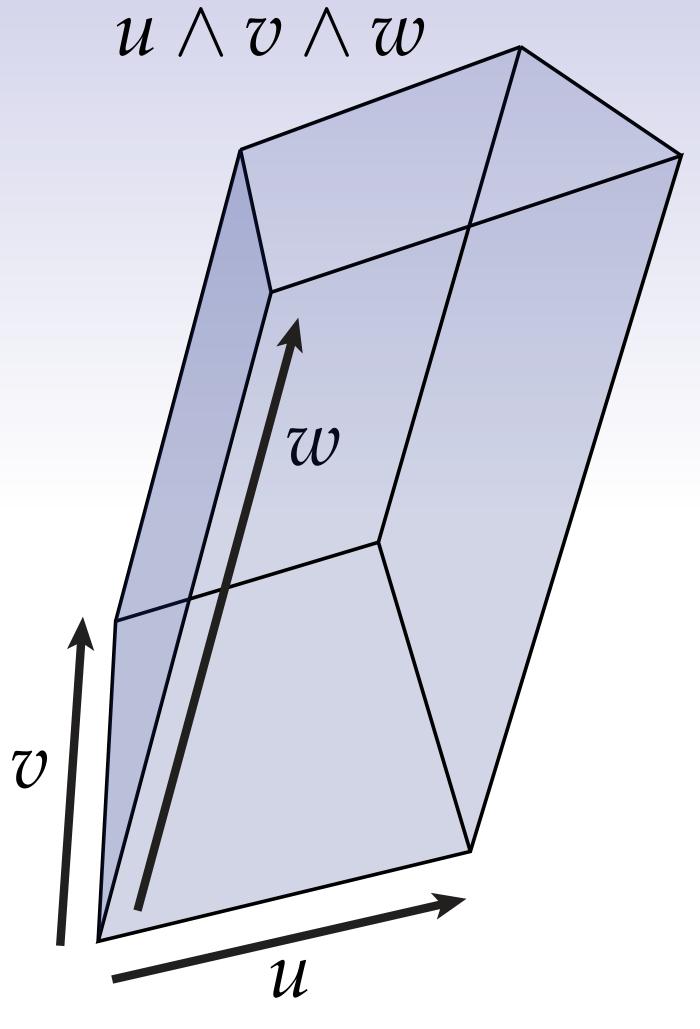
## Wedge Product - Distributivity



## k-Vectors

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





0-vector

1-vector

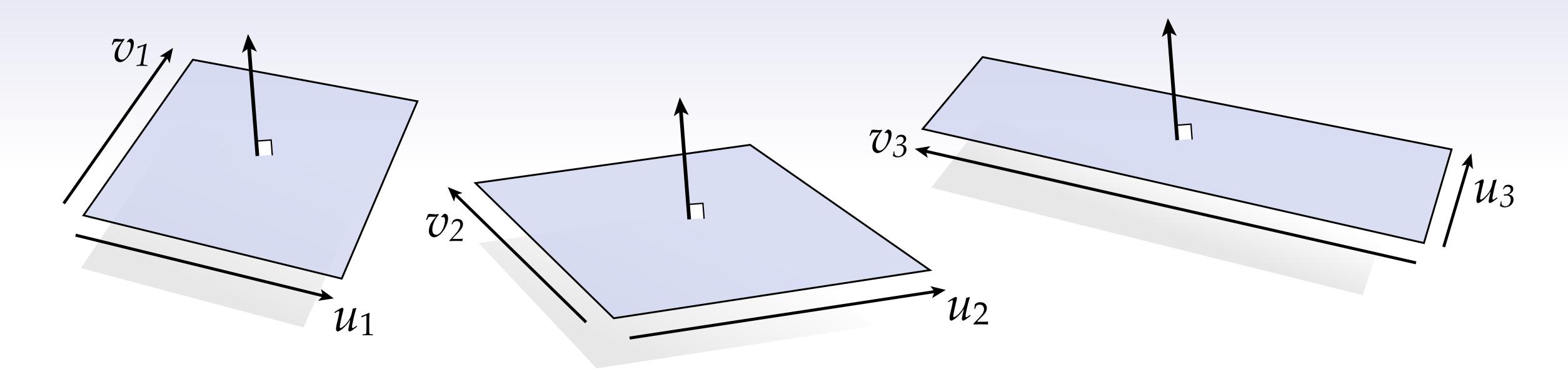
2-vector

3-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-form is an equivalence class of parallelograms...)

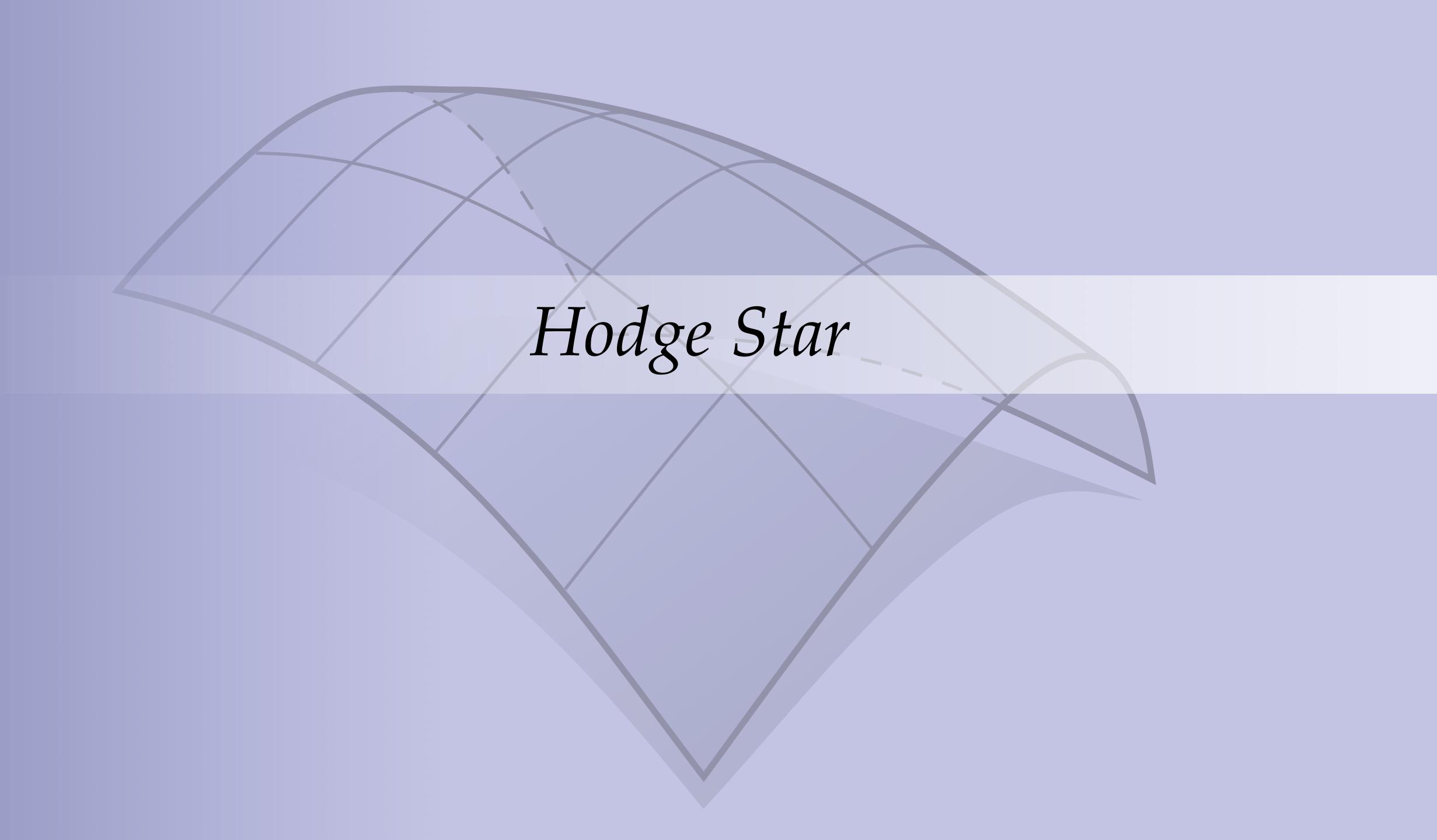
### 0-vectors as Scalars

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).

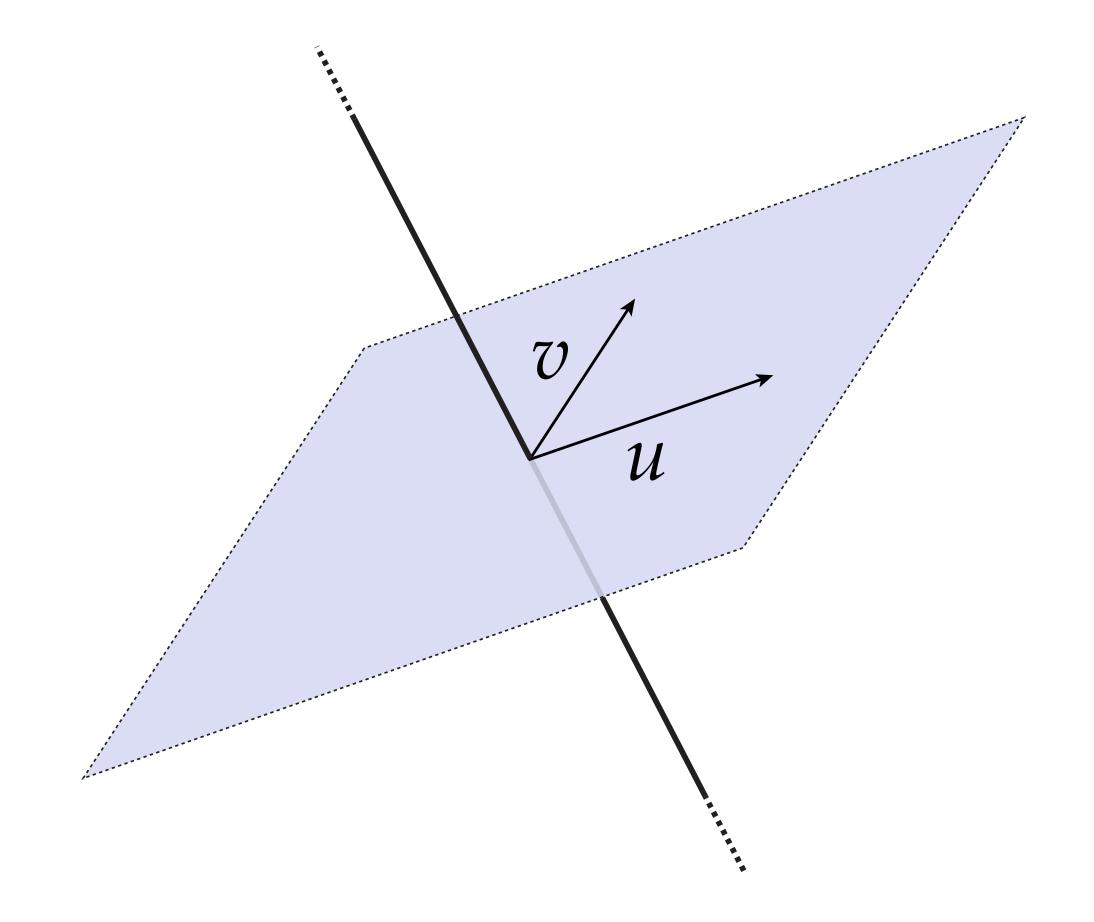


## Review: Orthogonal Complement

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

Example: orthogonal complement of a span

$$V := \operatorname{span}(\{u, v\})$$
 
$$V^{\perp} := \{x \in V \mid \langle x, w \rangle = 0 \ \forall \ w \in V\}$$



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

## Orthogonal Complement

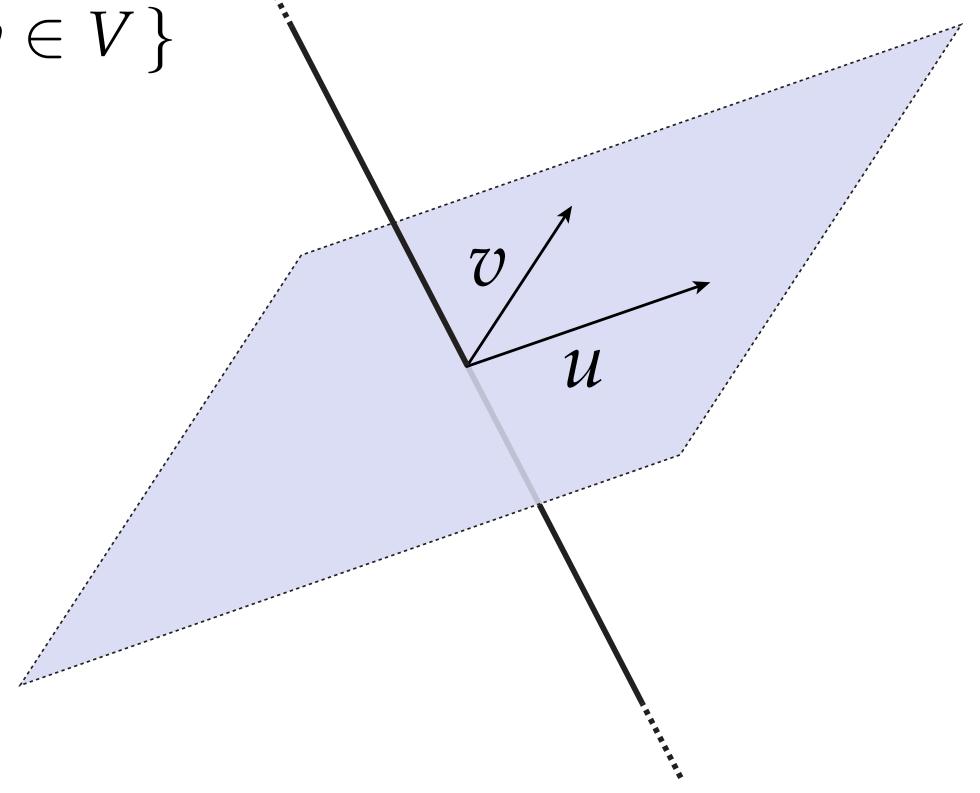
**Definition.** Let  $(V, \langle \cdot, \cdot \rangle)$  be a real inner product space, and let  $U \subseteq V$  be a linear subspace. The *orthogonal complement* of V is the collection of vectors

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

Example. "What kind of cuisine do you like?"

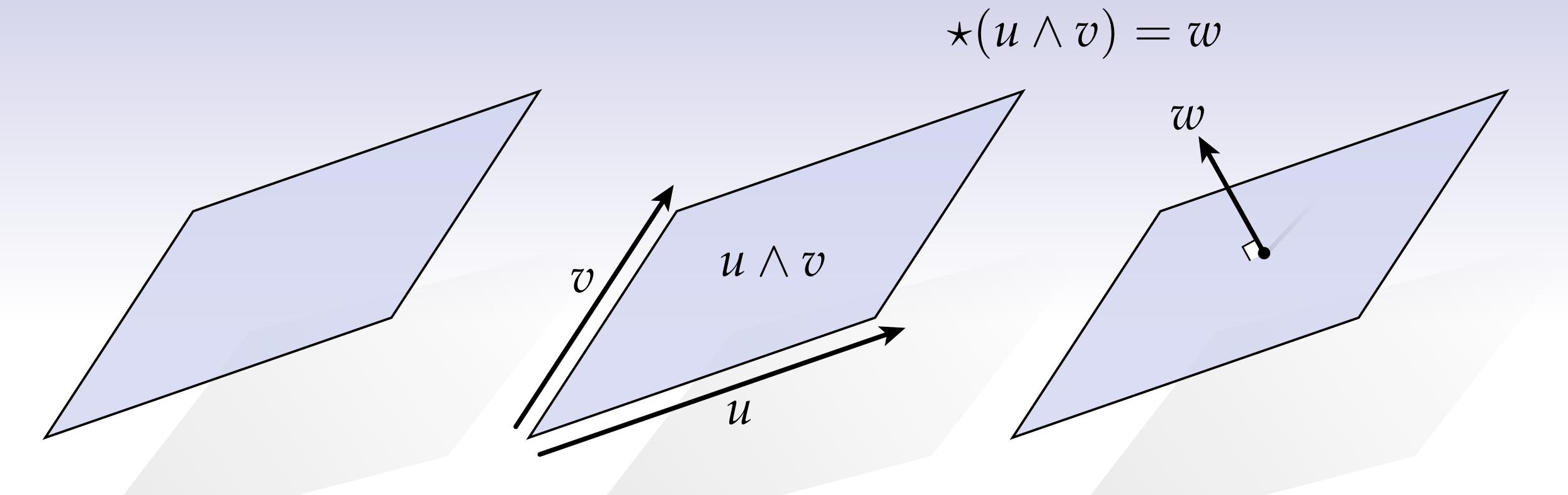
Option 1: "I like Vietnamese, Italian, Ethiopian, ..."

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 (\*)



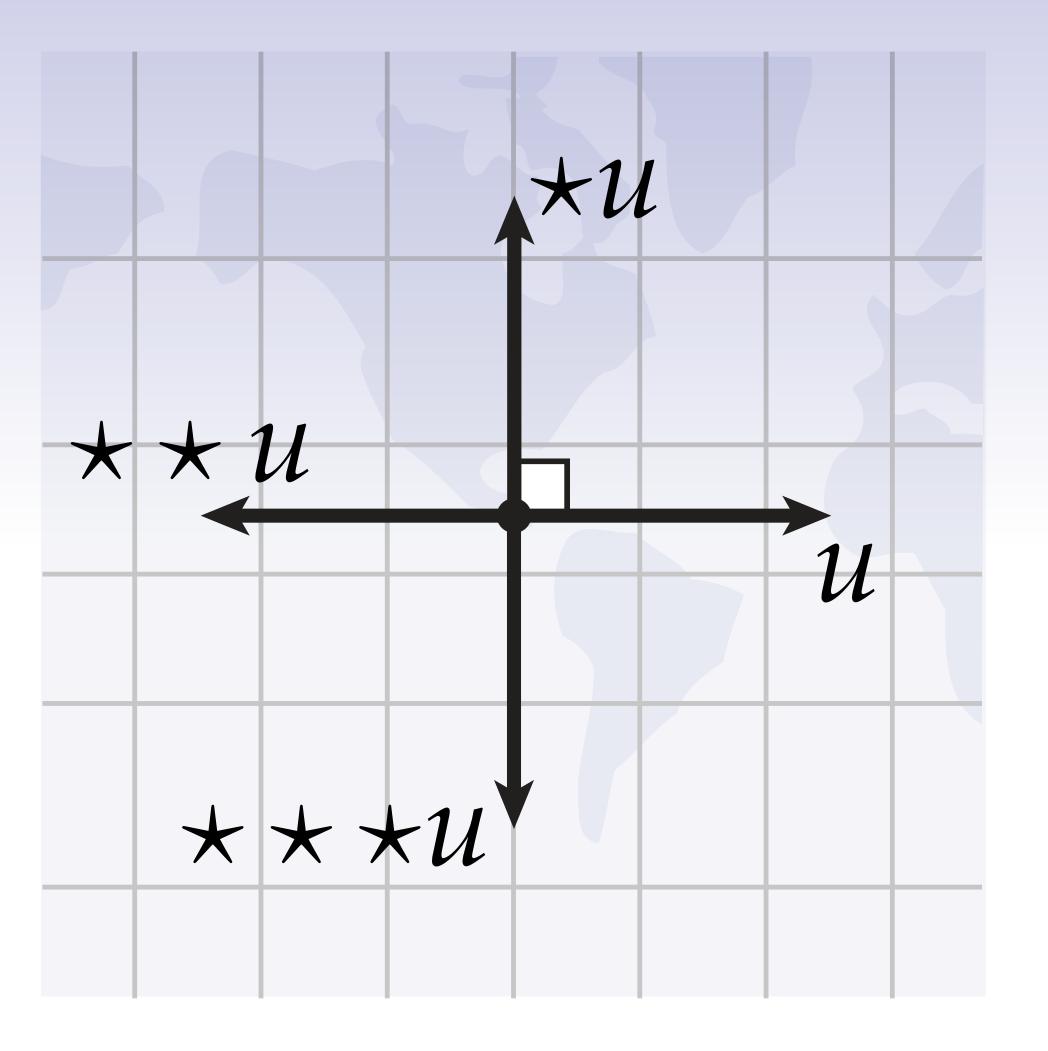
Analogy: orthogonal complement

Key differences: orientation & "finite extent"

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

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

## Hodge Star - 2D

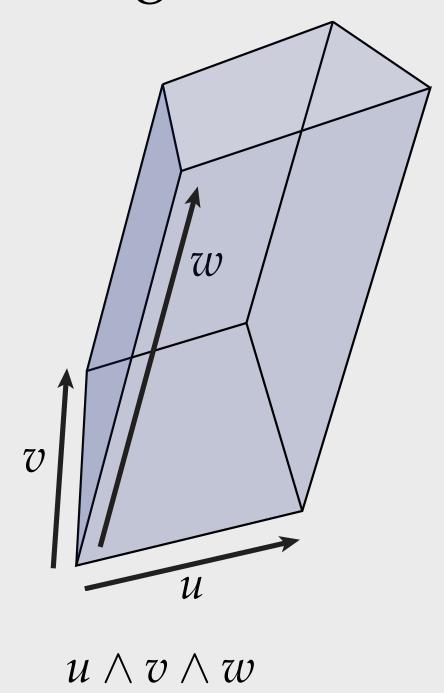


Analogy: 90-degree rotation

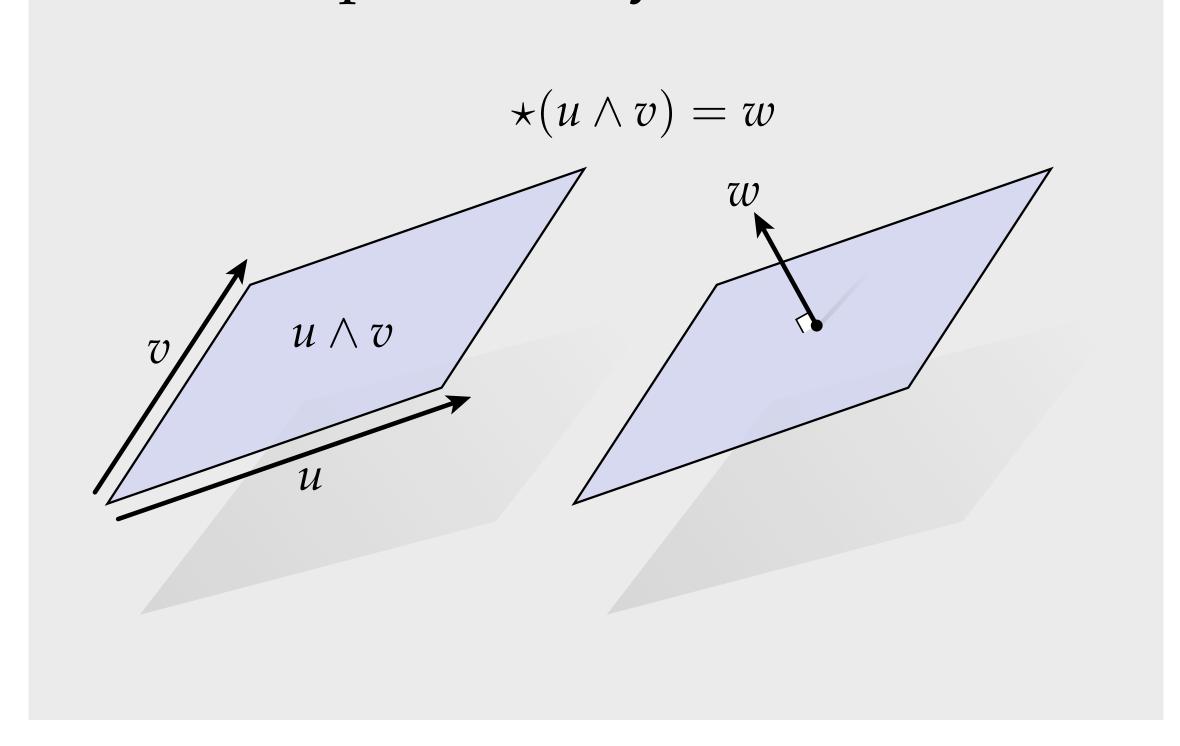
## Exterior Algebra—Recap

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  $\{e_1, \ldots, e_n\}$  is a *basis* for V if every vector  $v \in V$  can be expressed as

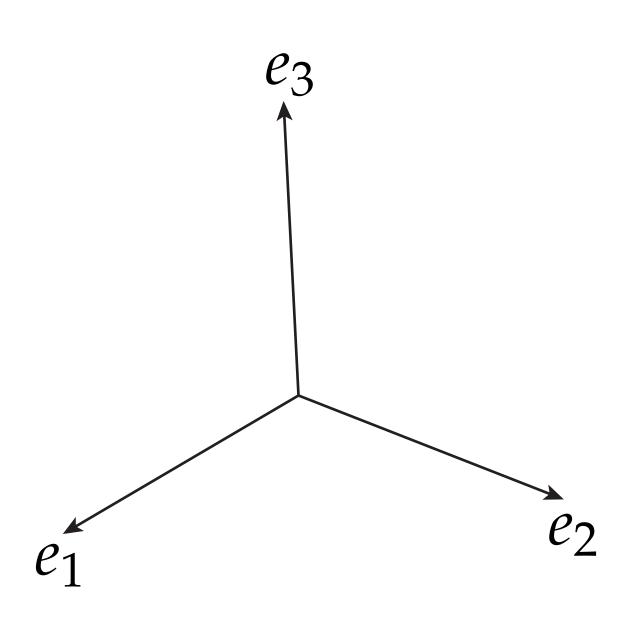
$$v = v_1 e_1 + \cdots + v_n e_n$$

for some collection of coefficients  $v_1, \ldots, v_n \in \mathbb{R}$ , 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.

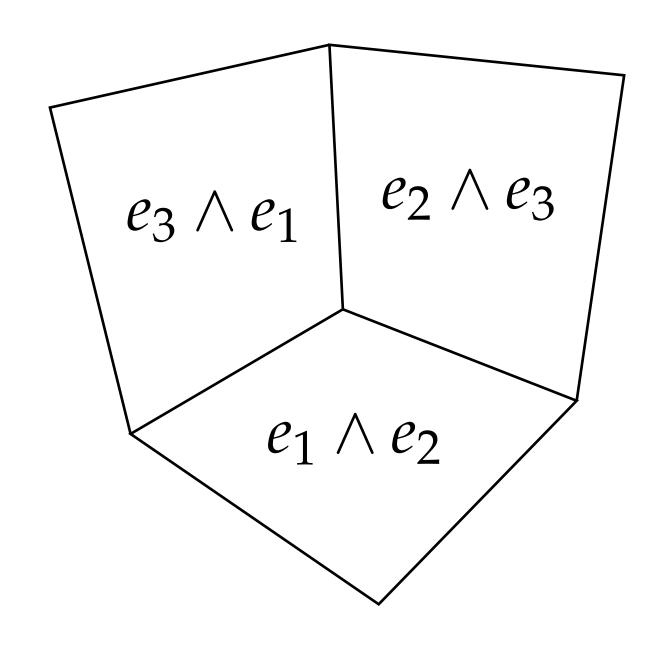
## Basis k-Vectors — Visualized

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

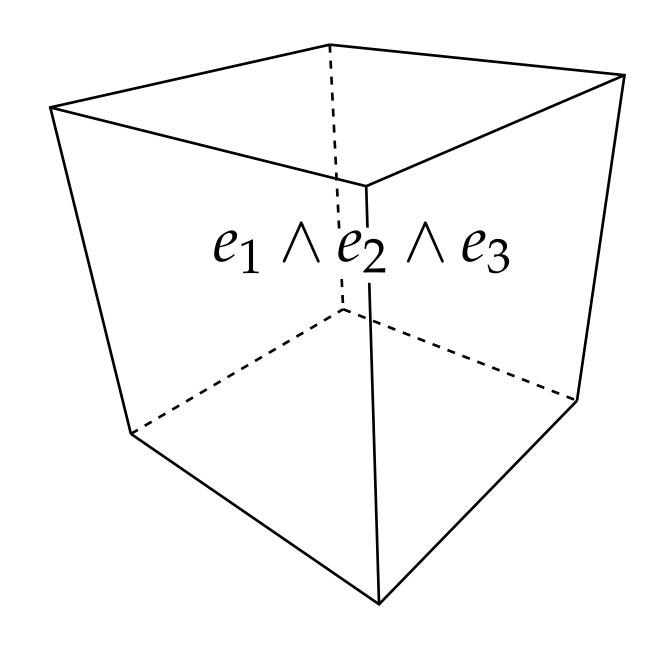
#### basis 1-vectors



#### 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?

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

Q: How many basis 3-vectors?

$$e_{1} \wedge e_{2} \wedge e_{3}$$

$$e_{1} \wedge e_{2} \wedge e_{4}$$

$$e_{1} \wedge e_{3} \wedge e_{4}$$

$$e^{2} \wedge e^{3} \wedge e^{4}$$

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
	A

## Hodge Star—Basis k-Vectors

Consider  $V = \mathbb{R}^3$  with 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  $\alpha := e_{i1} \wedge \cdots \wedge e_{i_k}$ , 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  $\star \alpha = e_3 \land e_1$ , since then

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

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

```
\begin{array}{rcl}
\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{array}
```

## Exterior Algebra—Formal Definition

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

$$\wedge_{k,l}: \bigwedge^k \times \bigwedge^l \to \bigwedge^{k+l}$$

uniquely determined by its action on basis elements; in particular, for any collection of distinct indices  $i_1, \ldots, i_{k+1}$ ,

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

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

$$\star: \bigwedge^k \to \bigwedge^{n-k}$$

uniquely determined by the relationship

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

where  $\alpha$  is any k-vector of the form  $\alpha = e_{i_1} \wedge \cdots \wedge e_{i_k}$  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  $\bigwedge^k$  together with the maps  $\wedge$  and  $\star$  define an *exterior algebra* on V, sometimes known as a *graded algebra*.

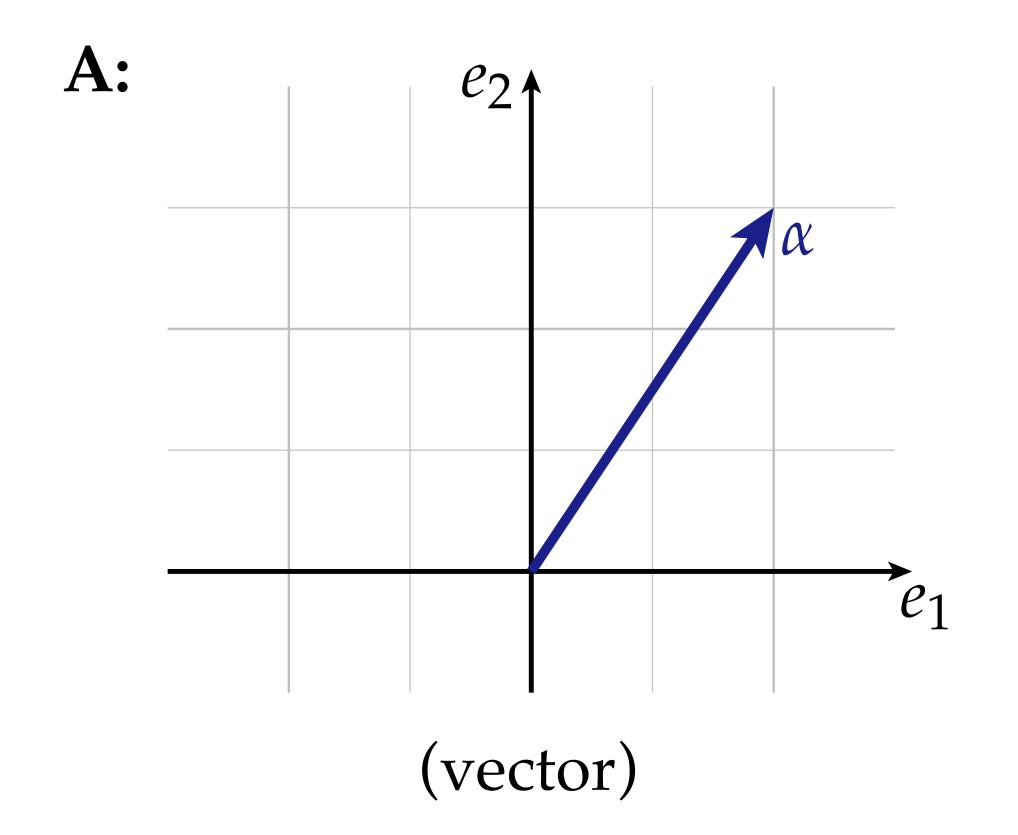
(...don't worry too much about this!)

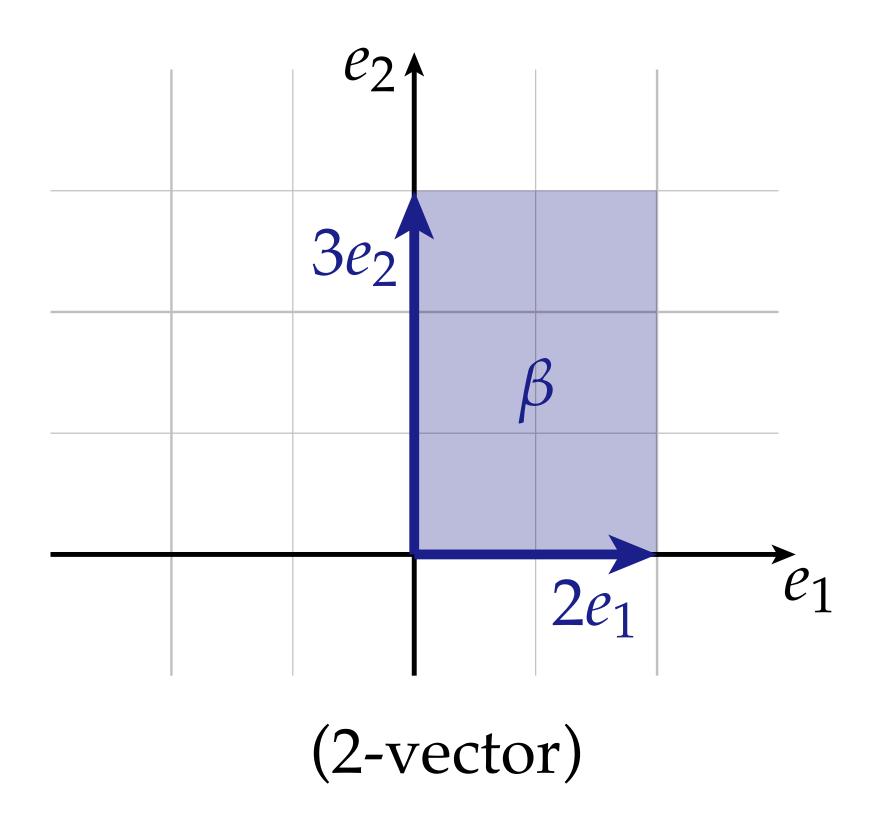
## Sanity Check

Q: What's the difference between

$$\alpha = 2e_1 + 3e_2$$

$$\alpha = 2e_1 + 3e_2$$
 and  $\beta = 2e_1 \wedge 3e_2$ ?





## Exterior Algebra—Example

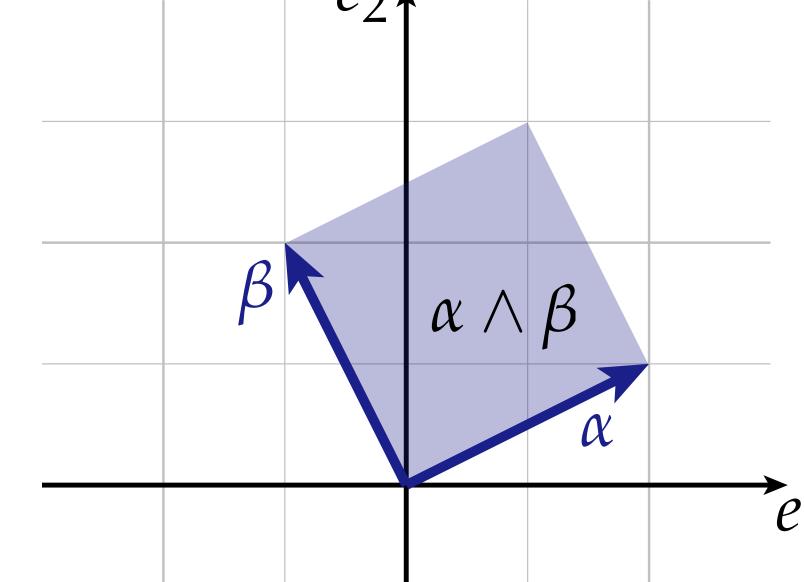
$$V = \mathbb{R}^2$$

$$\alpha = 2e_1 + e_2$$

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

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

A: 
$$\alpha \wedge \beta = (2e_1 + e_2) \wedge (-e_1 + 2e_2)$$
  
 $= (2e_1 + e_2) \wedge (-e_1) + (2e_1 + e_2) \wedge (2e_2)$   
 $= -2e_1 \wedge e_1 - 0 e_2 \wedge e_1 + 4e_1 \wedge e_2 + 2e_2 \wedge e_2 = 0$   
 $= e_1 \wedge e_2 + 4e_1 \wedge e_2$   
 $= 5e_1 \wedge e_2$ 



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

## Exterior Algebra—Example

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

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

$$\beta = 3e_3$$

$$\gamma = e_2 \wedge e_1$$

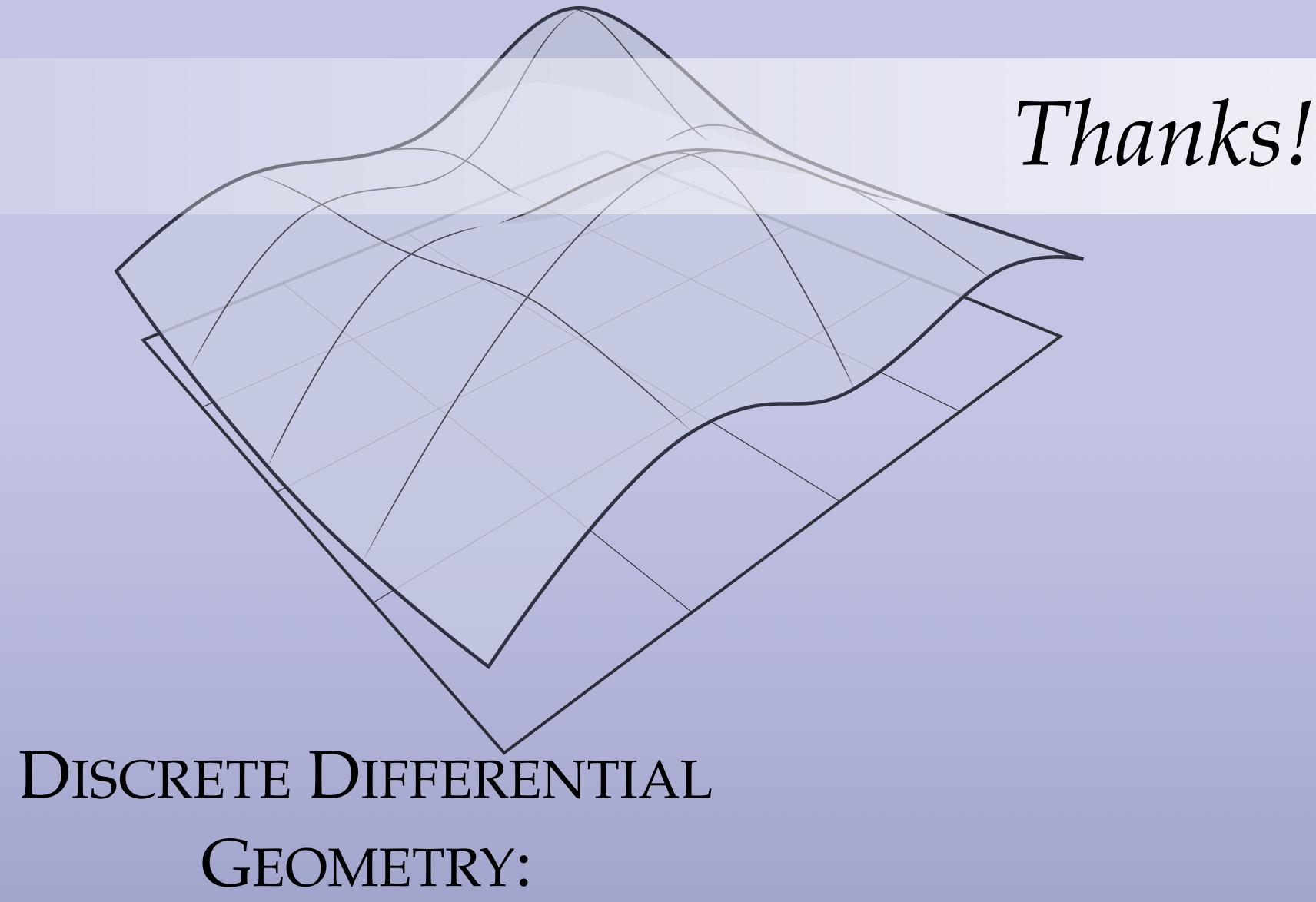
**Q**: What is 
$$\star(\alpha \land \beta + \beta \land \gamma)$$
?

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.

**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*-forms are all possible wedges of basis vectors



## AN APPLIED INTRODUCTION

Keenan Crane • CMU 15-458/858B • Fall 2017