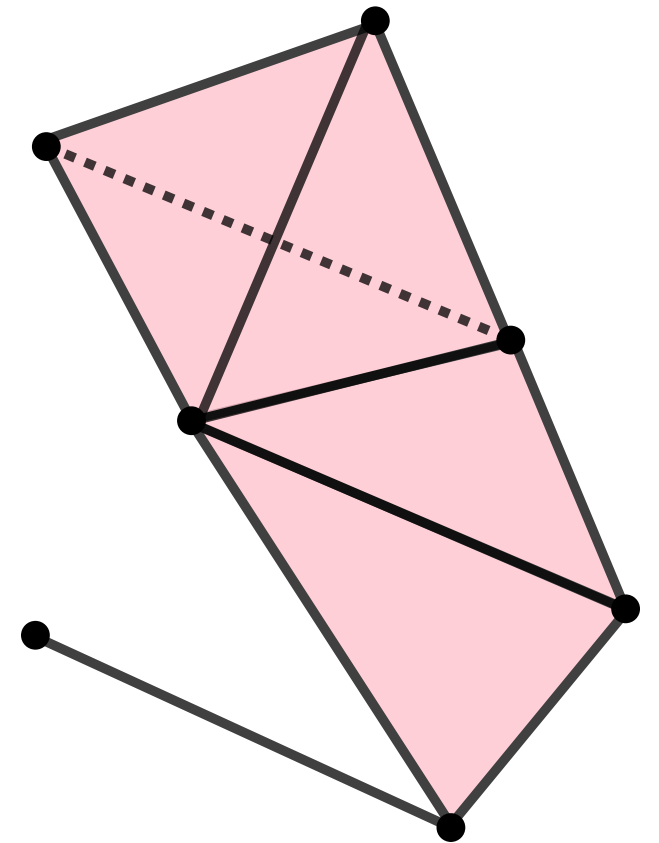


# Abstract simplex and simplicial complex

**Def:** Let  $P = \{p_1, \dots, p_n\}$  be a (finite) set. An **abstract simplicial complex**  $K$  with vertex set  $P$  is a set of subsets of  $P$  satisfying the two conditions:

- (i) the elements of  $P$  belong to  $K$ ,
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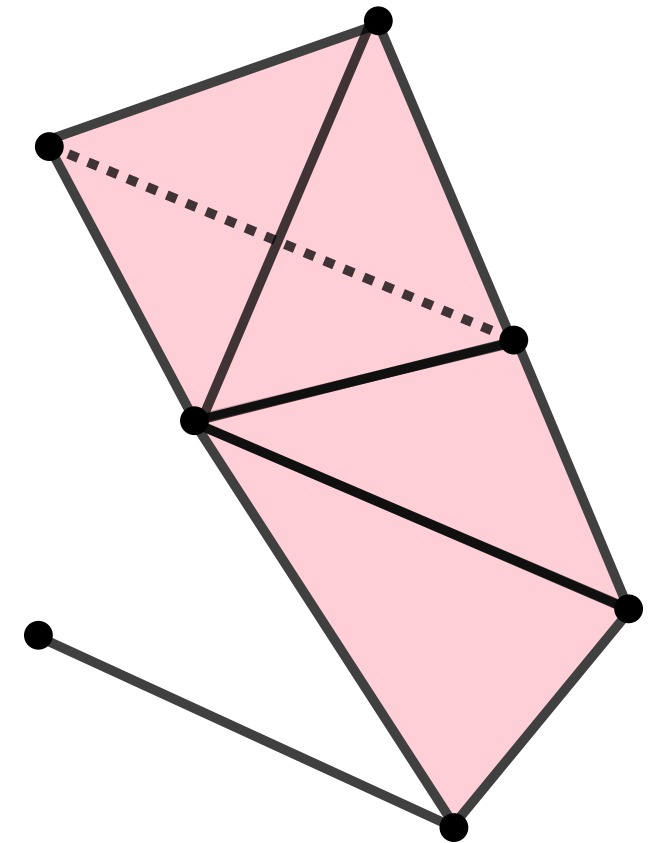


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## IMPORTANT

Simplicial complexes can be seen at the same time as geometric/topological spaces (good for topological/geometrical inference) and as combinatorial objects (abstract simplicial complexes, good for computations).

# Abstract simplex and simplicial complex

**Def:** A **realization** of an abstract simplicial complex  $K$  is a geometric simplicial complex  $K'$  who is isomorphic to  $K$ , i.e., there exists a bijection

$$f : \text{vert}(K) \rightarrow \text{vert}(K'),$$

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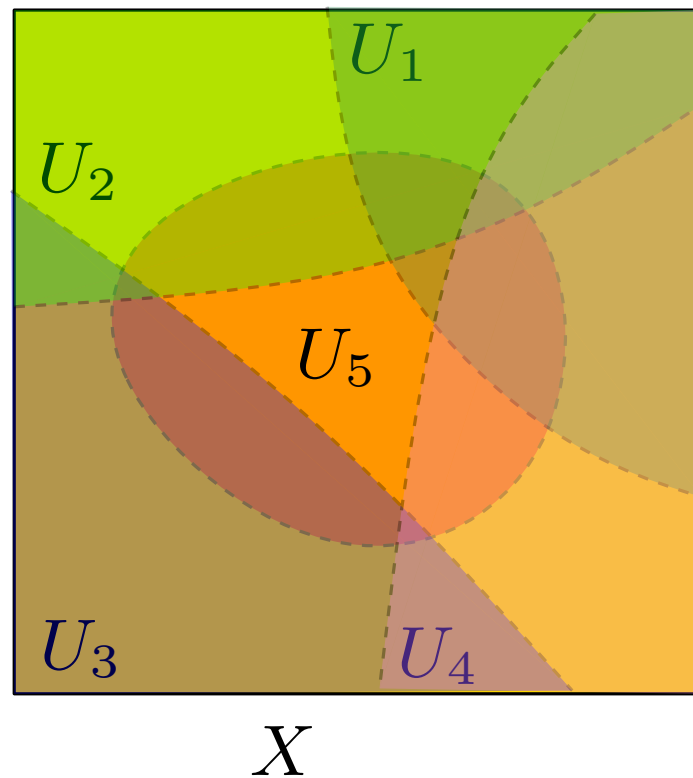
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Abstract simplicial complexes and their realizations are *homeomorphic*.

# Nerve complex

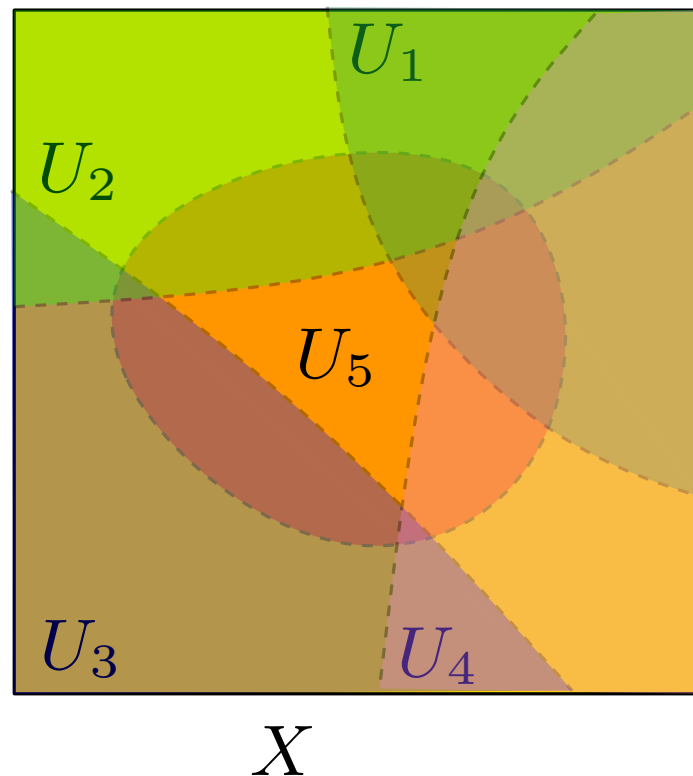
**Def:** An **open cover** of a topological space  $X$  is a collection  $\mathcal{U} = (U_i)_{i \in I}$  of open subsets  $U_i \subseteq X$ ,  $i \in I$  where  $I$  is a set, such that  $X \subseteq \cup_{i \in I} U_i$ .

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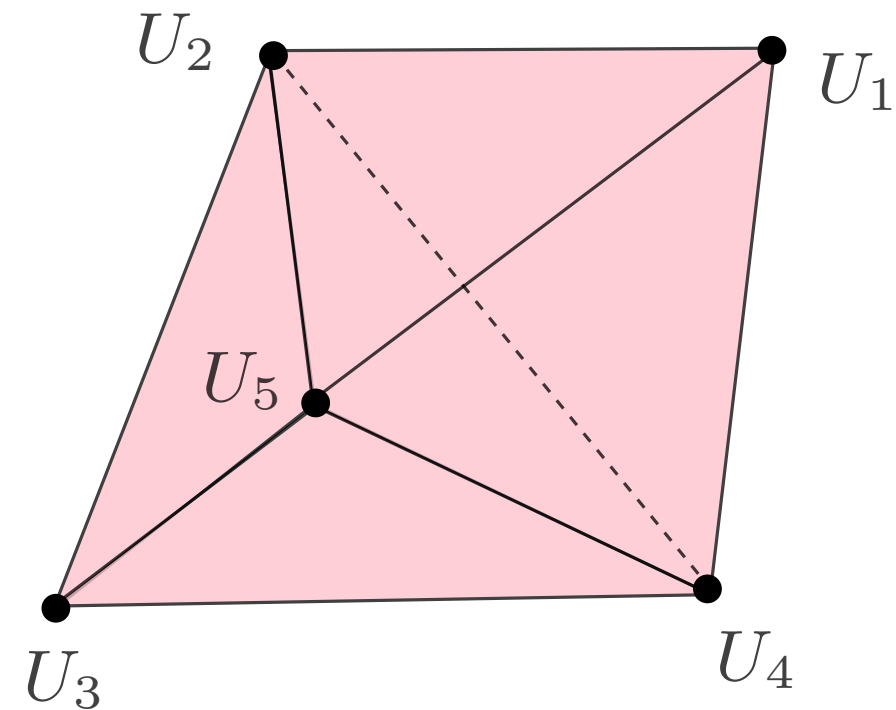
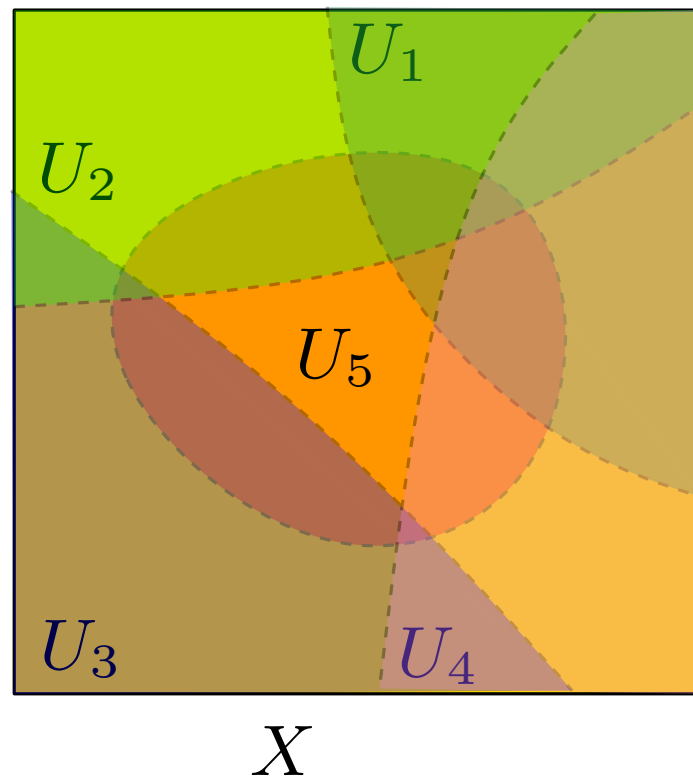
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$$\sigma = [U_{i_0}, U_{i_1}, \dots, U_{i_k}] \in C(\mathcal{U}) \quad \text{if and only if} \quad \bigcap_{j=0}^k U_{i_j} \neq \emptyset.$$



# Nerve complex



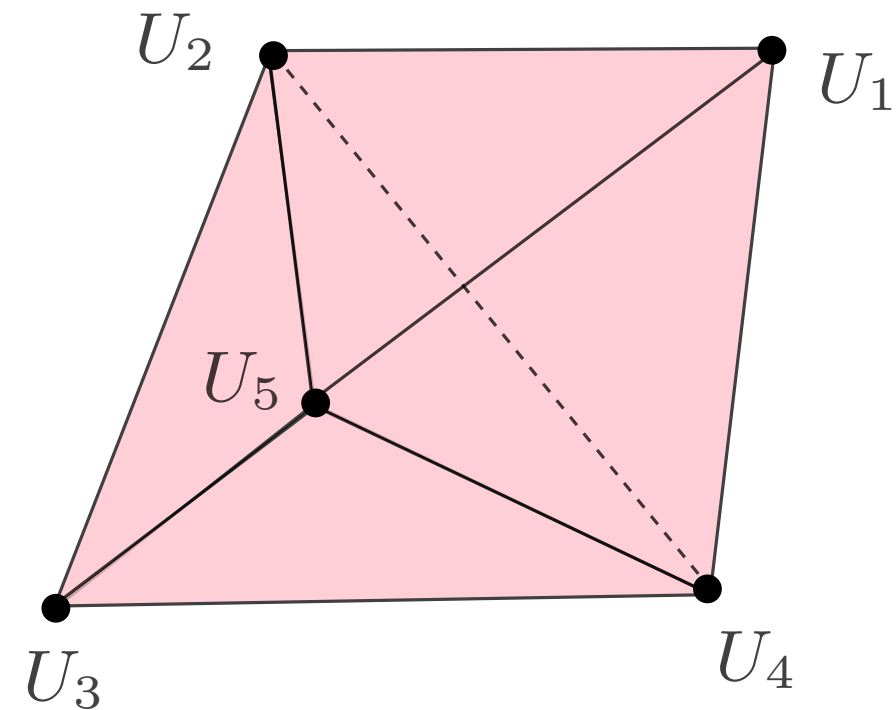
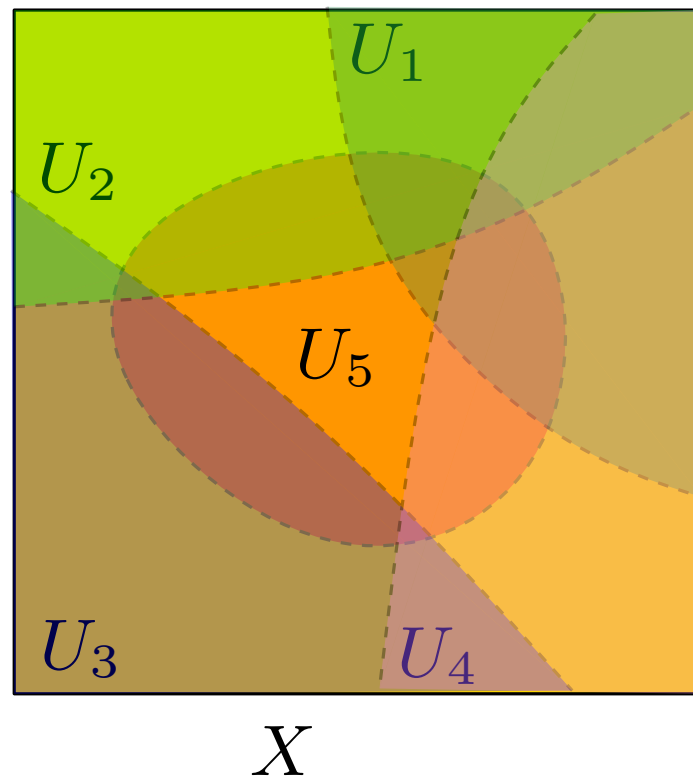
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# Nerve complex

[On the imbedding of systems of compacta in simplicial complexes, Borsuk, Fund. Math., 1948]



**The Nerve Theorem:** Let  $\mathcal{U} = (U_i)_{i \in I}$  be a finite open cover of a subset  $X$  of  $\mathbb{R}^d$  such that any intersection of the  $U_i$ 's is either empty or contractible. Then  $X$  and  $C(\mathcal{U})$  are homotopy equivalent.

In particular, every convex set is contractible.

# Čech and (Vietoris)-Rips complexes

**Def:** Given a point cloud  $P = \{P_1, \dots, P_n\} \subset \mathbb{R}^d$ , its Čech complex of radius  $r > 0$  is the abstract simplicial complex  $C(P, r)$  s.t.  $\text{vert}(C(P, r)) = P$  and

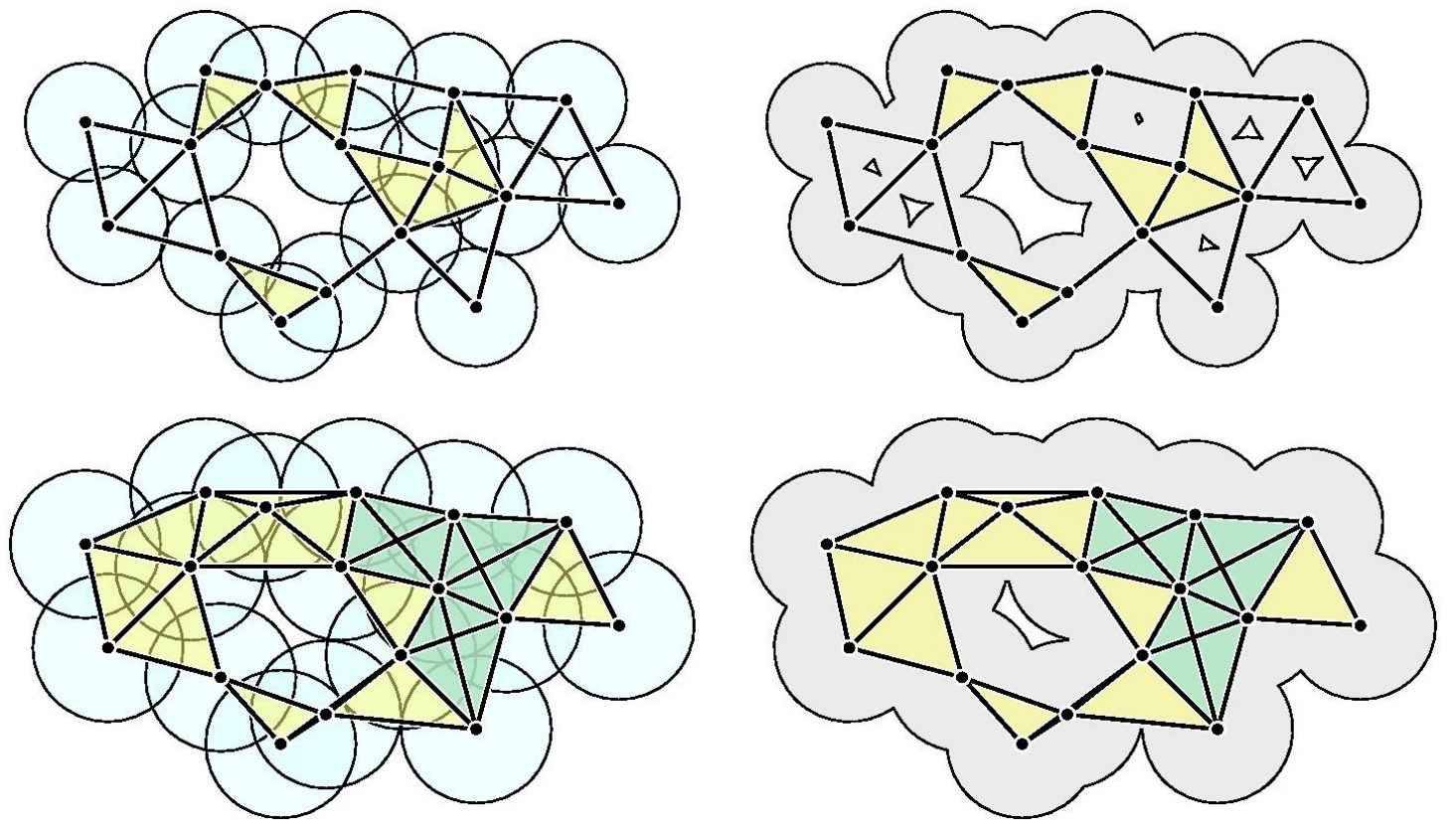
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**Q:** Does the Nerve Theorem apply to Čech complexes?



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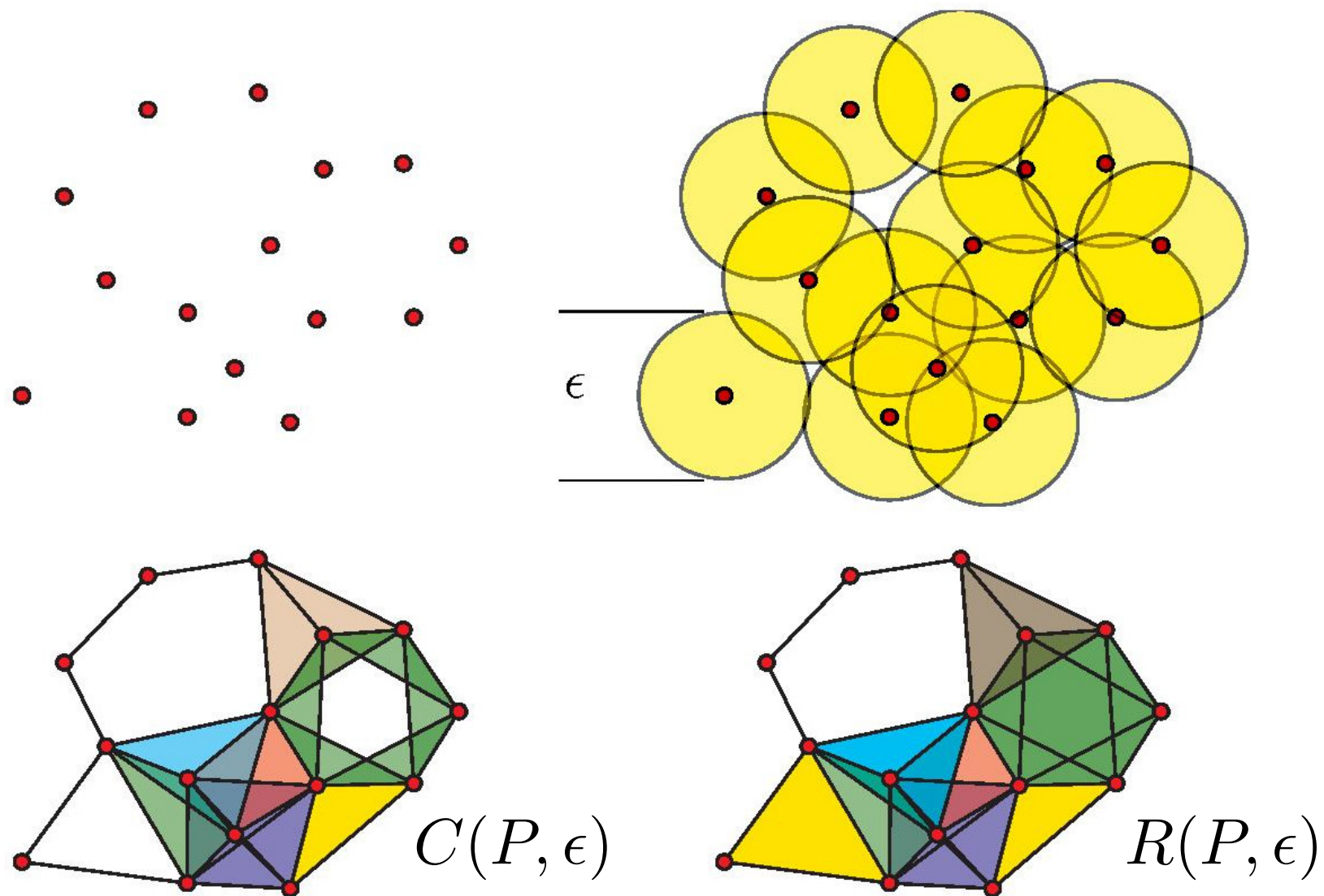
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**Prop:**  $R(P, r/2) \subseteq C(P, r) \subseteq R(P, r)$ .

**Q:** Prove it.

# Storing simplicial complexes

[*The Simplex Tree: An Efficient Data Structure for General Simplicial Complexes*, Boissonnat, Maria, Algorithmica, 2014]

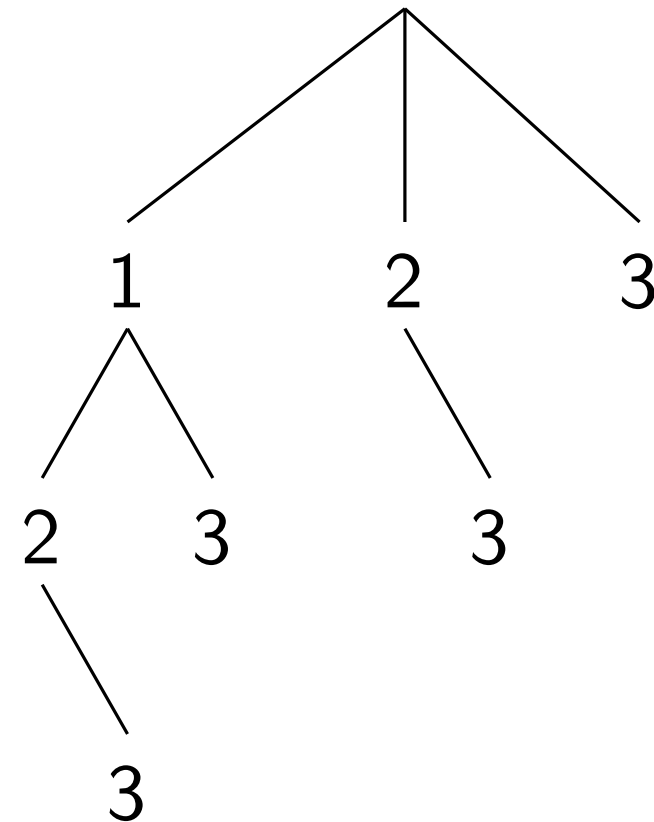
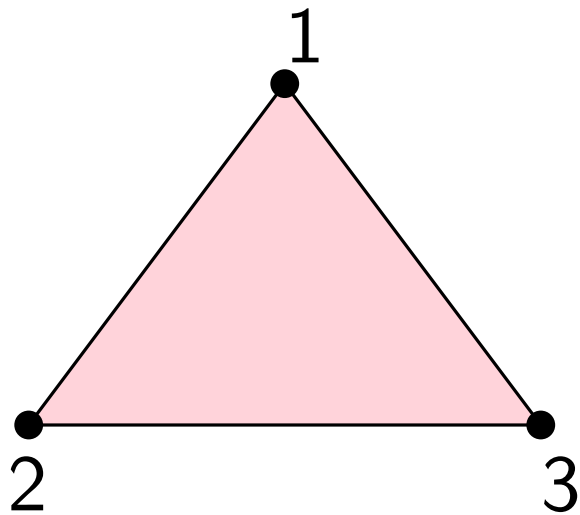
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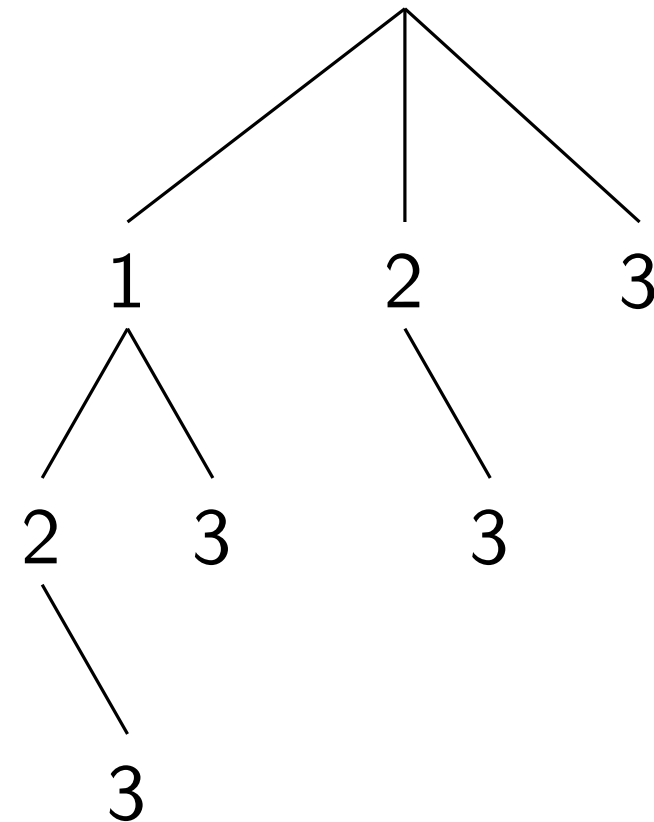
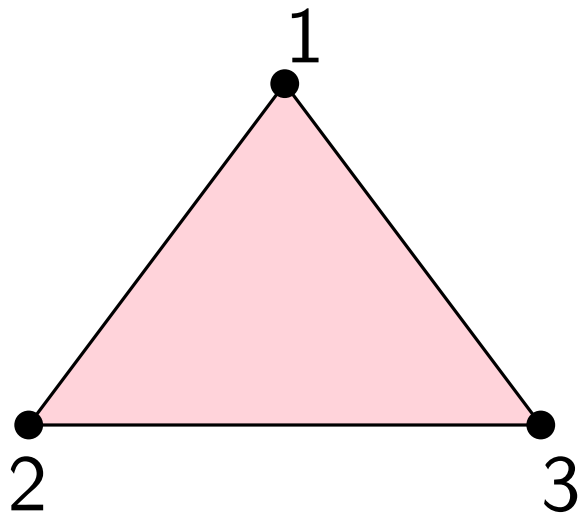


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This is called the *simplex tree*.

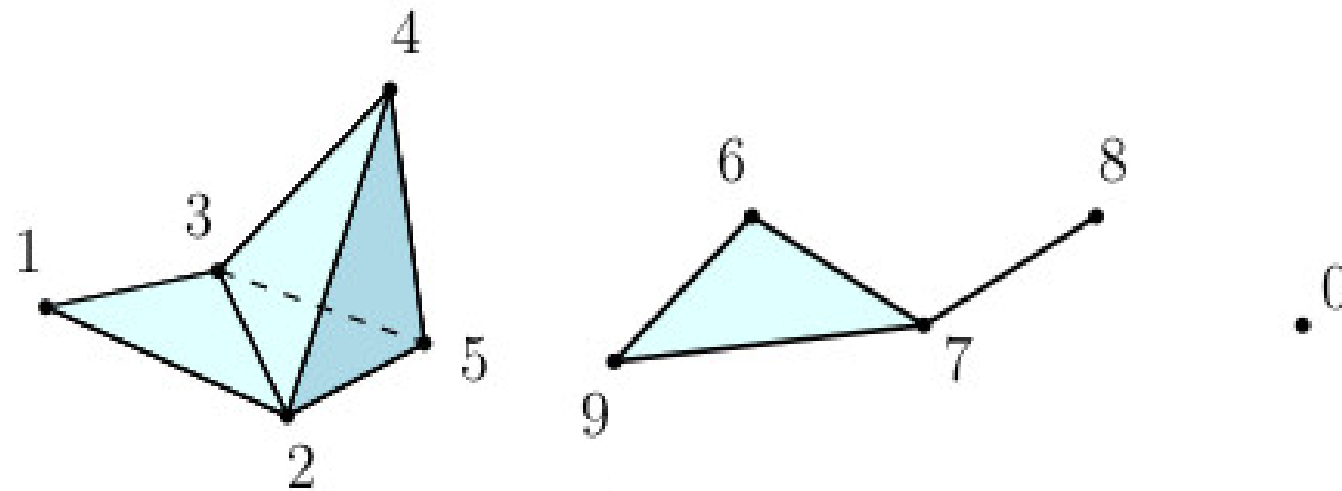
It allows to store all simplices explicitly without storing all adjacency relations, while maintaining low complexity for basic operations.

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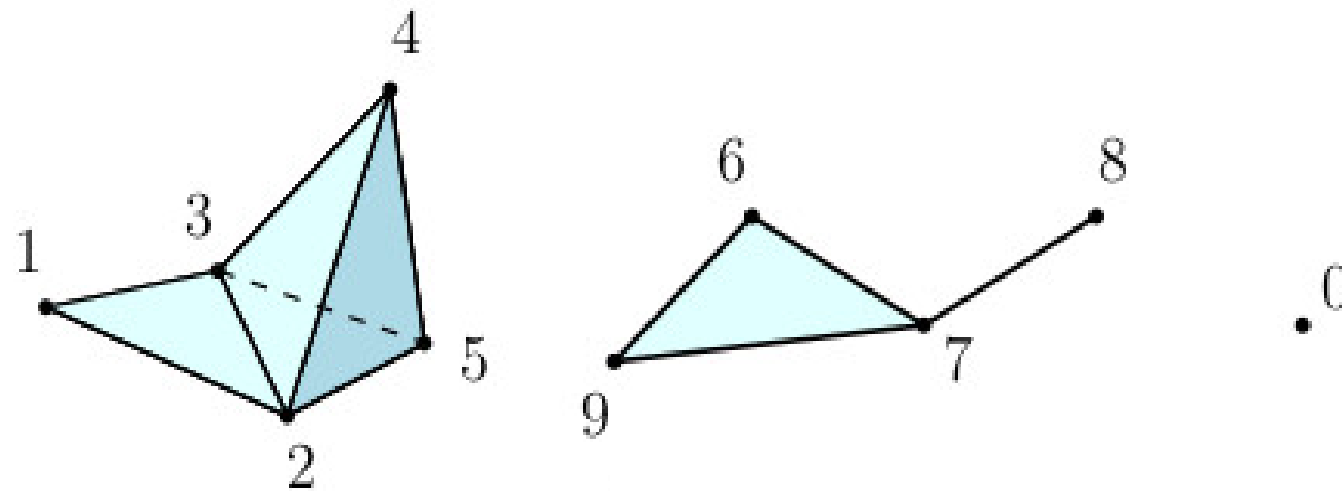


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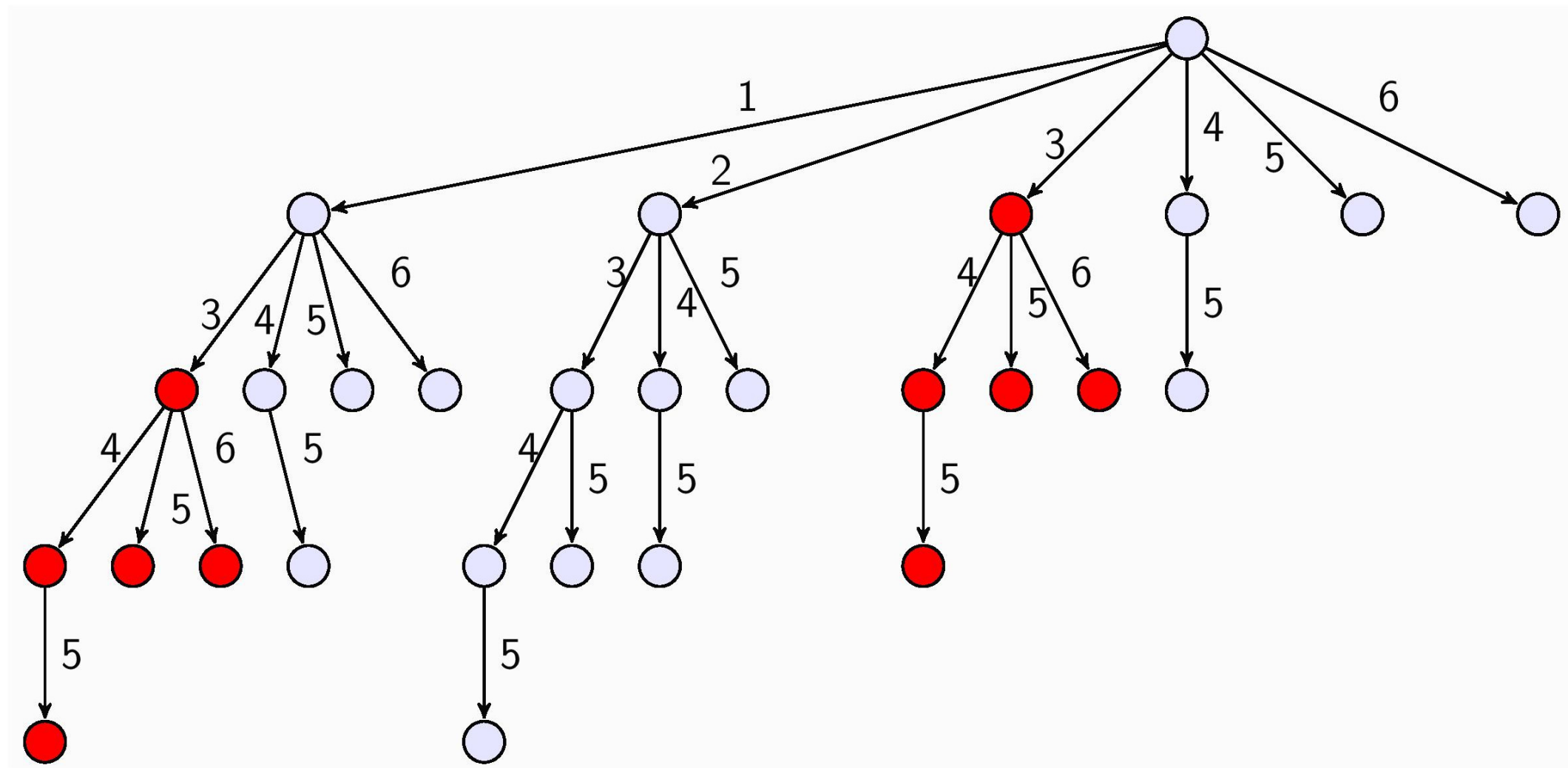
Depth of simplex tree = 1 + dimension of complex

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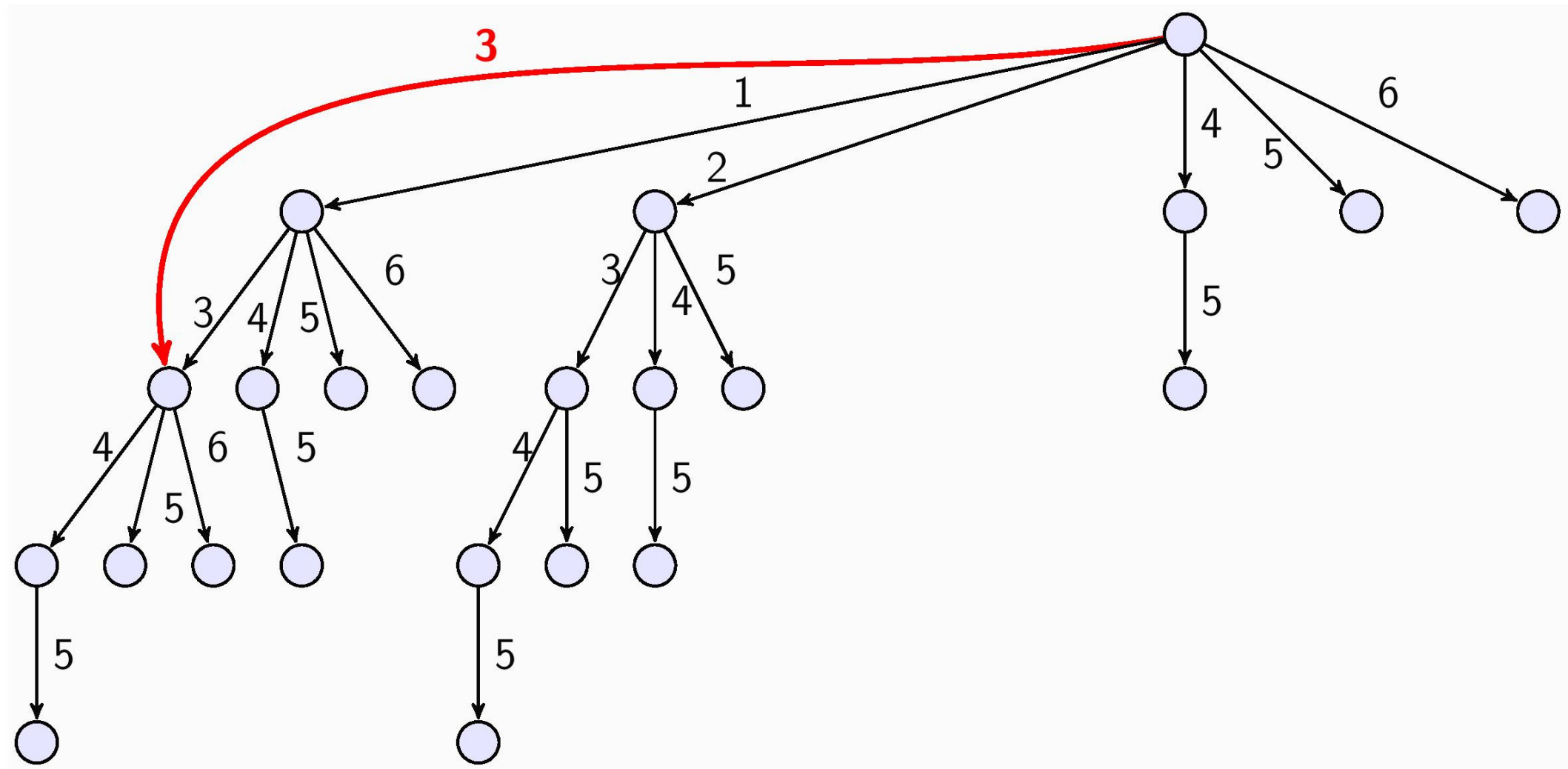


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# The homology groups

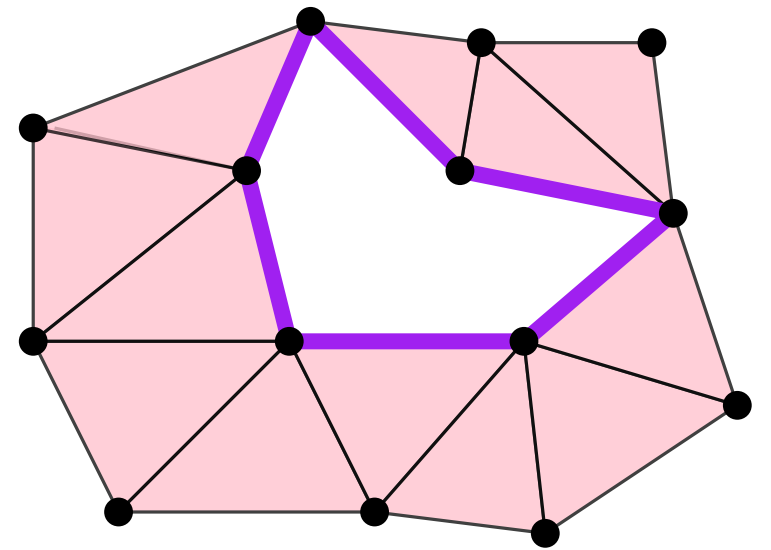
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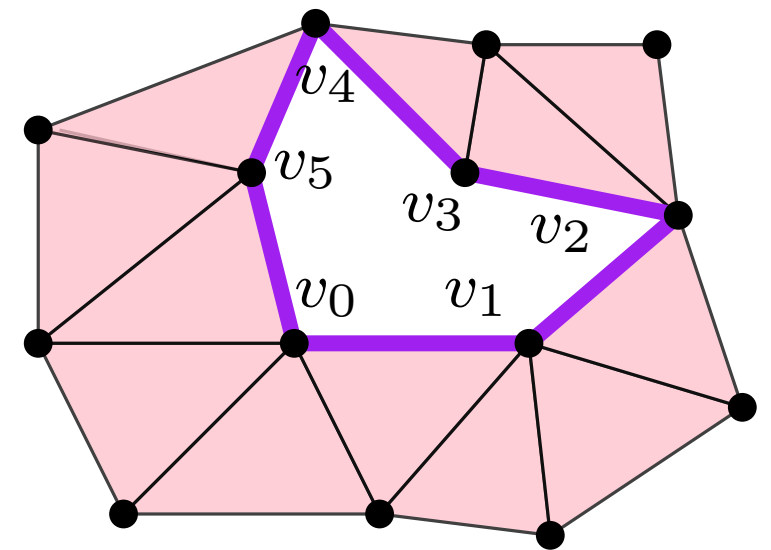


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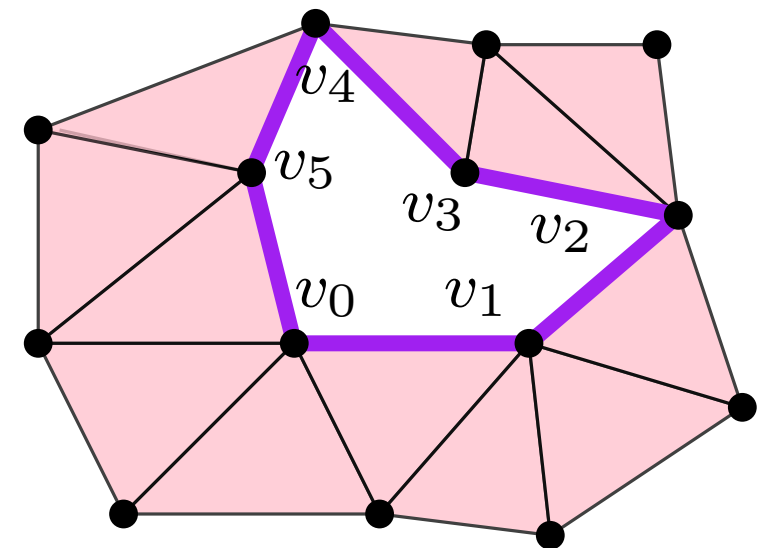
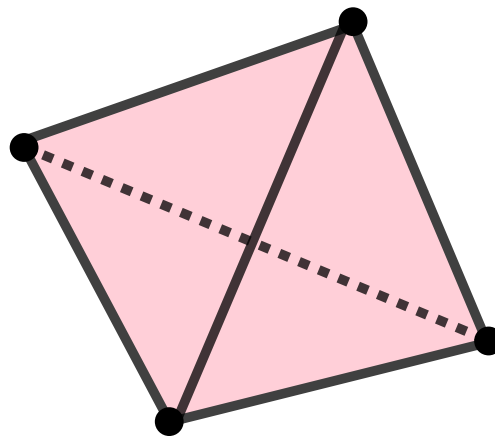
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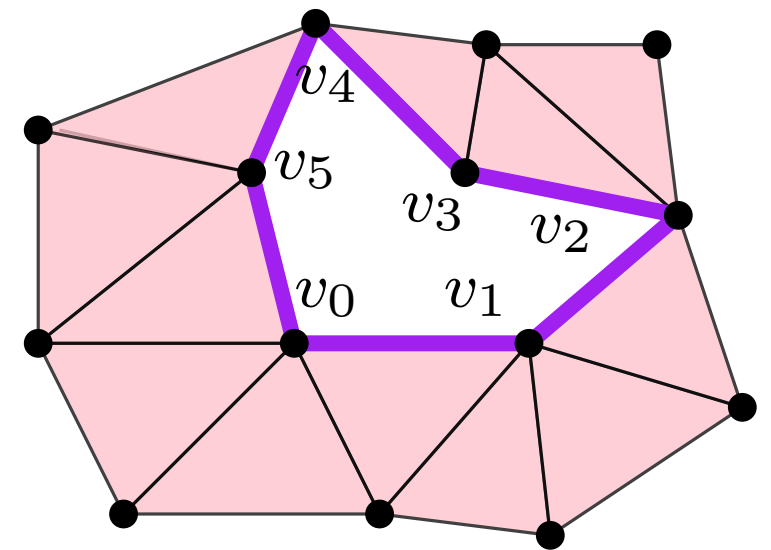
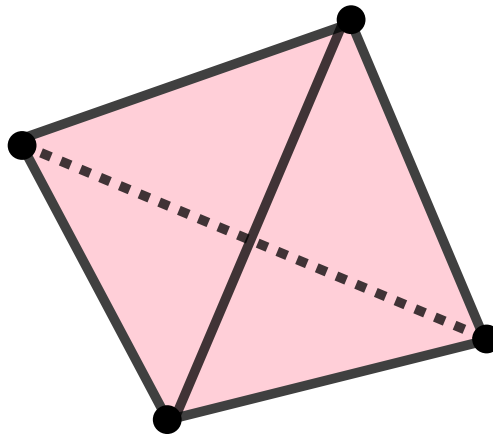
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But what about higher dimensional holes (like the inside of a tetrahedron)?



**A:** A hole in dimension  $d$  is a simplicial complex in which each  $(d-1)$ -simplex appears an even number of times.



# The homology groups

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$$\begin{aligned}\partial_1 C &= \partial_1[v_0, v_1] + \partial_1[v_1, v_2] + \partial_1[v_2, v_3] + \partial_1[v_3, v_4] + \partial_1[v_4, v_5] + \partial_1[v_5, v_0] \\ &= [v_0] + \cancel{[v_1]} + \cancel{[v_1]} + \cancel{[v_2]} + \cancel{[v_2]} + \cancel{[v_3]} + \cancel{[v_3]} + \cancel{[v_4]} + \cancel{[v_4]} + \cancel{[v_5]} + \cancel{[v_5]} + [v_0] \\ &= [v_0] + [v_0] = 0.\end{aligned}$$

**Def:** A  $d$ -cycle is a  $d$ -chain  $C$  s.t.  $\partial C = 0$ .

# The homology groups

**Def:** A  $d$ -chain is a formal sum of  $d$ -simplices with coefficients in  $\mathbb{Z}/2\mathbb{Z}$ .

$$C = [v_0, v_1] + [v_1, v_2] + [v_2, v_3] + [v_3, v_4] + [v_4, v_5] + [v_5, v_0].$$

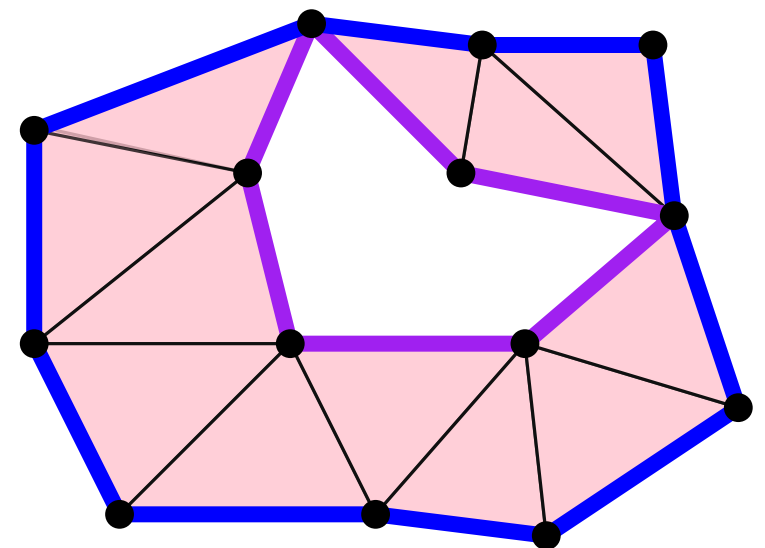
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**Pb:** Cycles are not holes!!



# The homology groups

**Lemma:**  $\partial_{n-1} \circ \partial_n = 0$ .

**Q:** Prove it.



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$$C \sim C' \iff C + C' \in \text{im}(\partial)$$

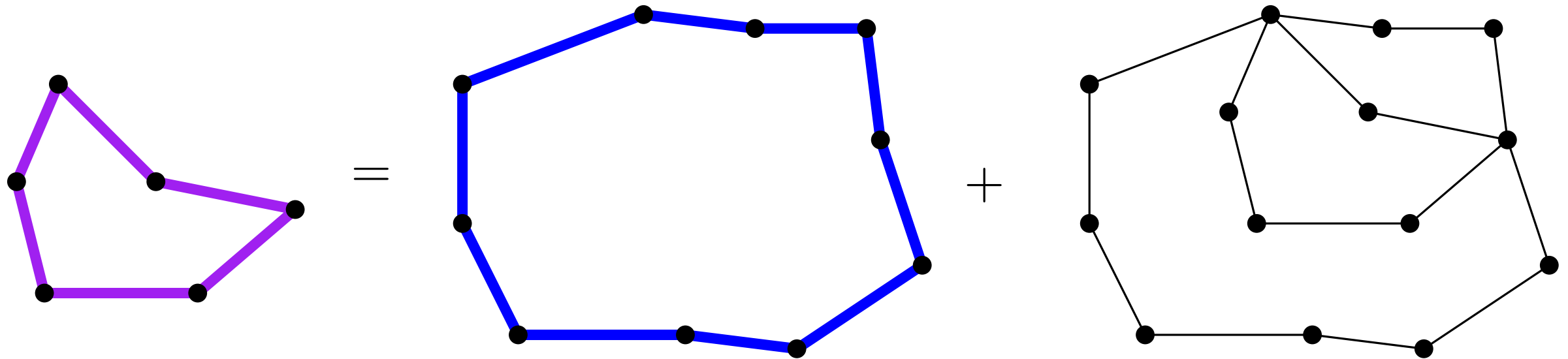
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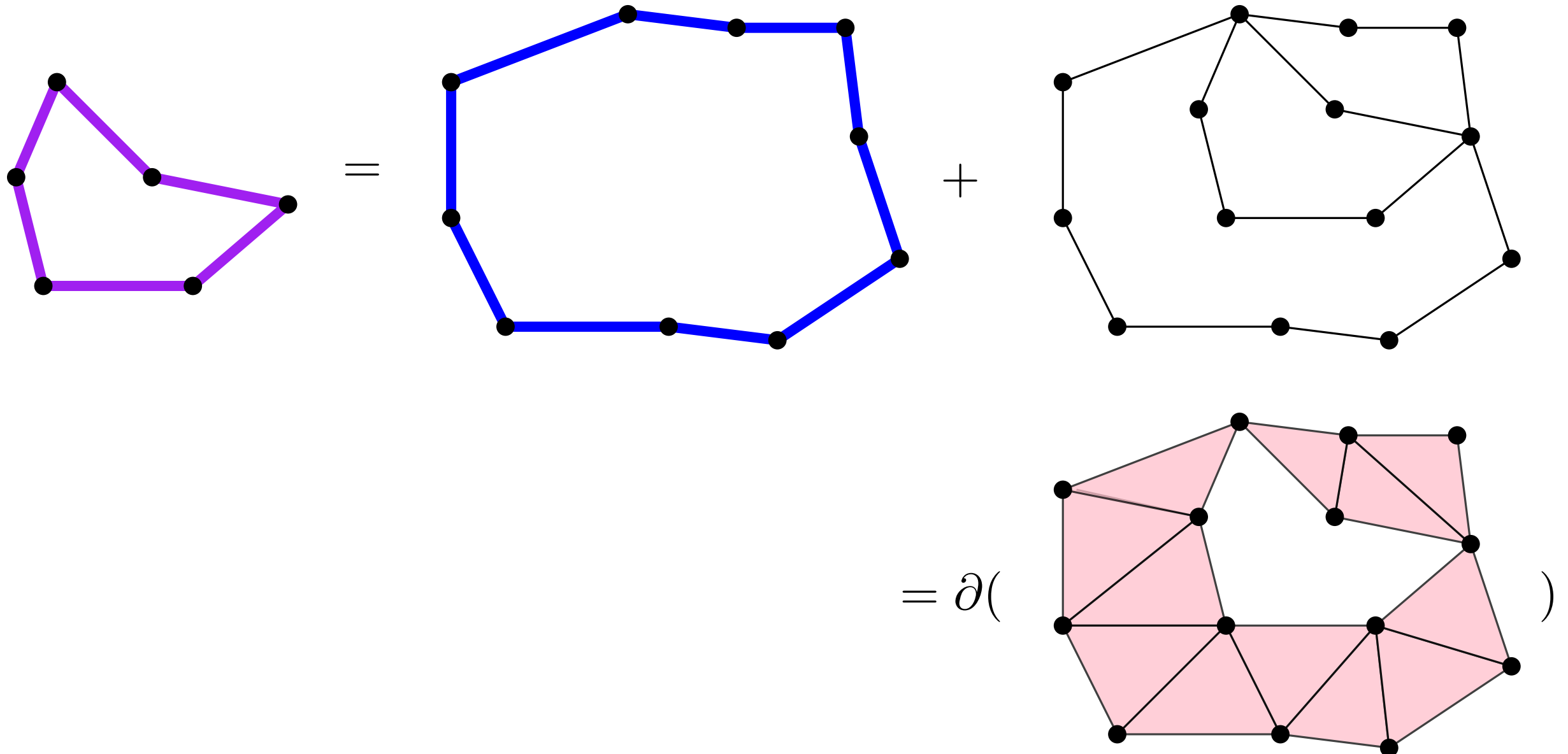
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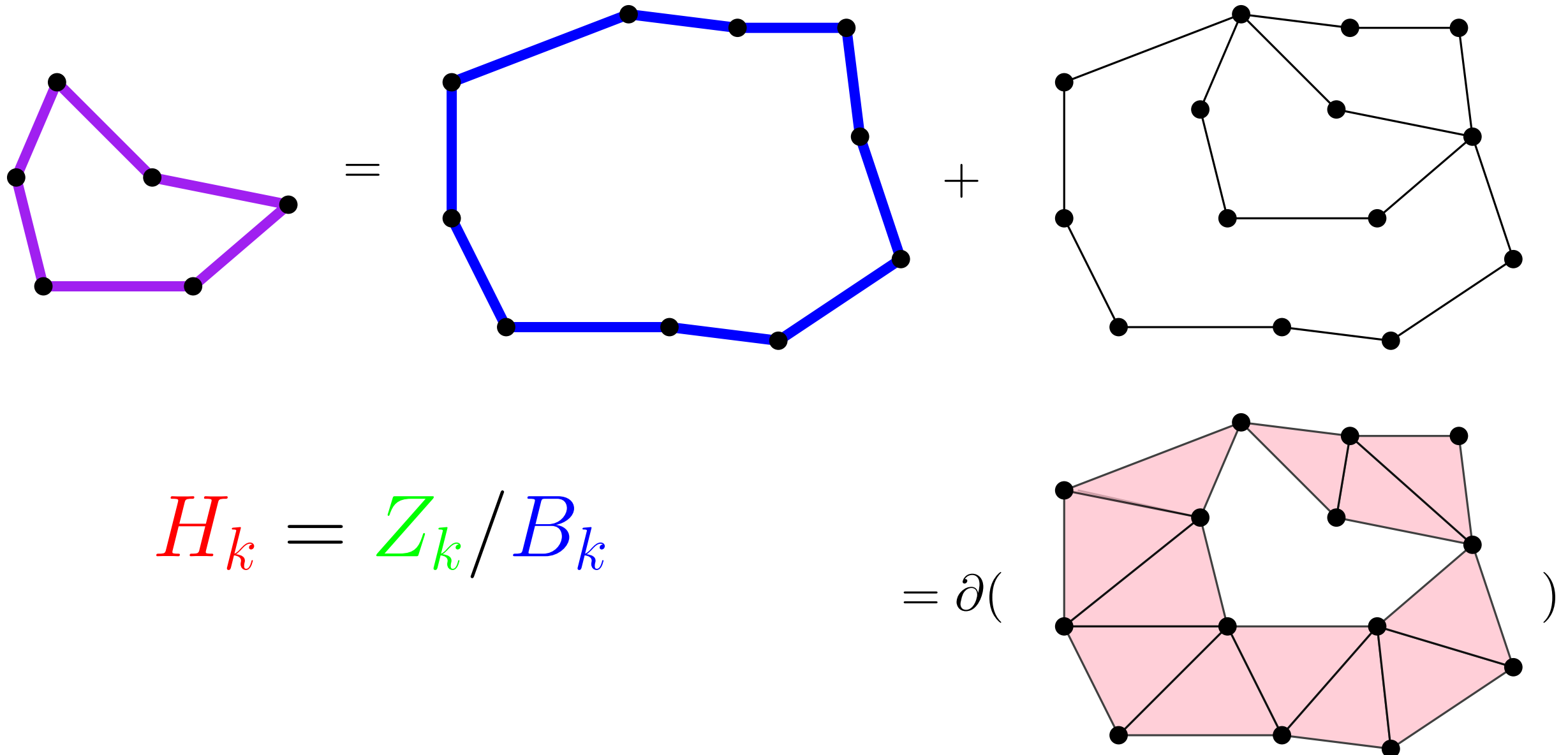
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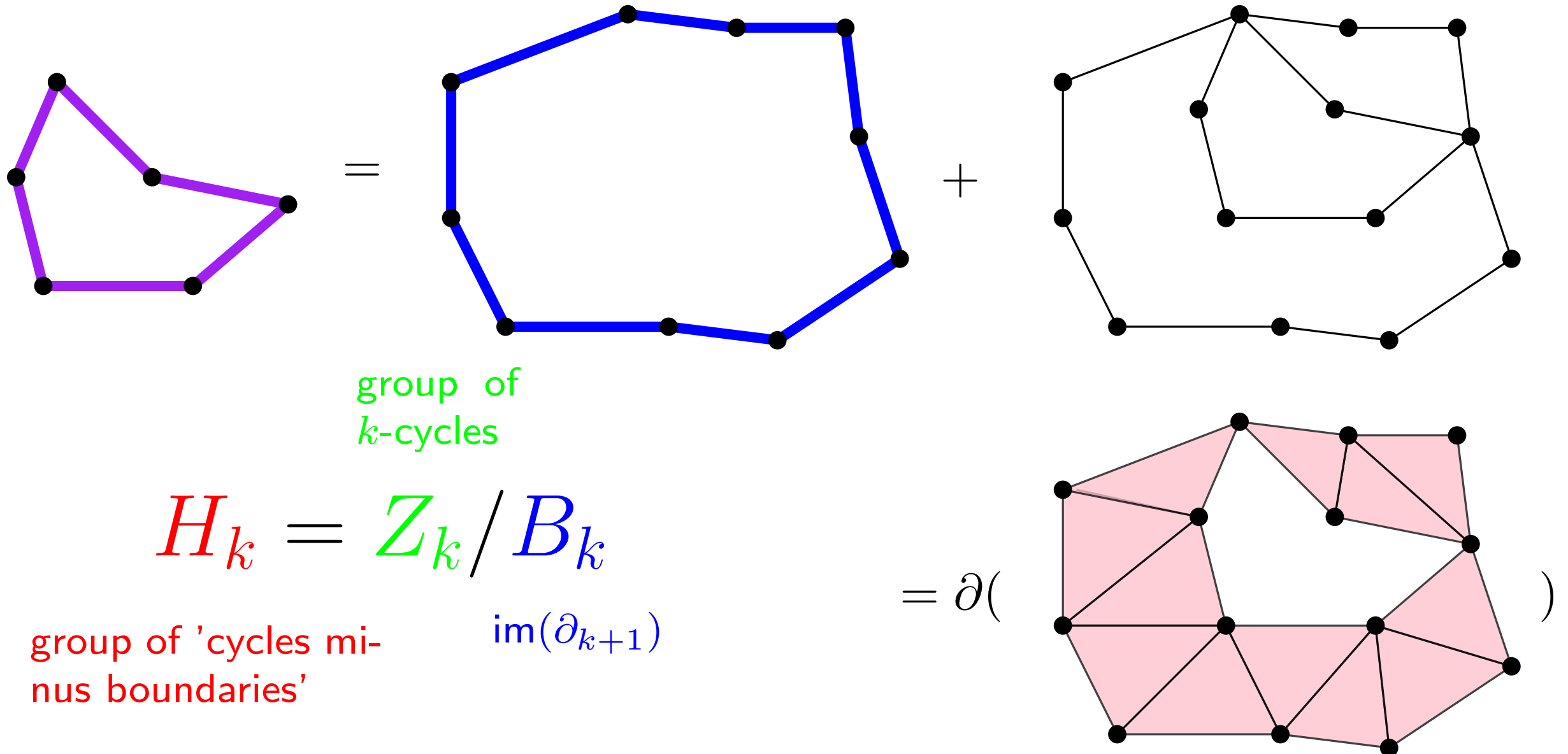
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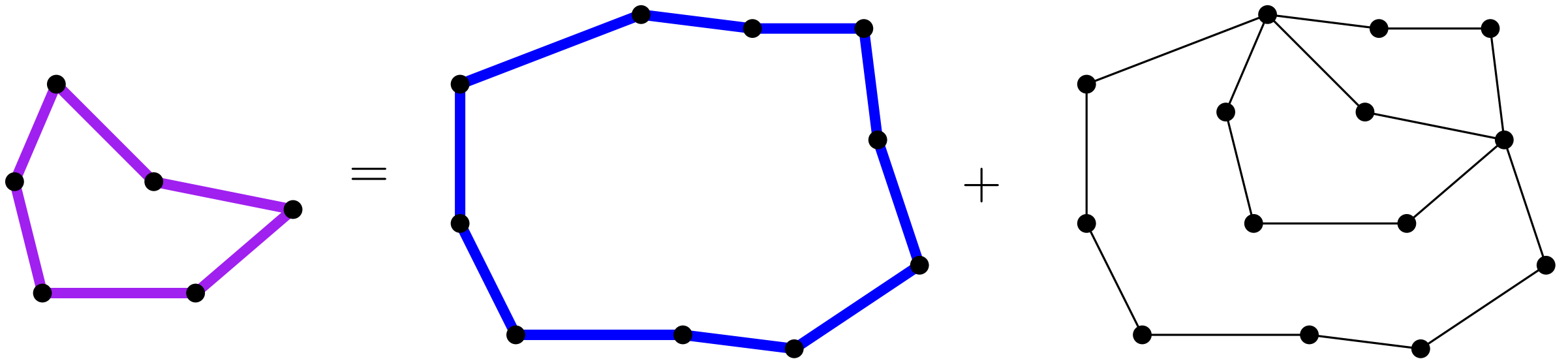
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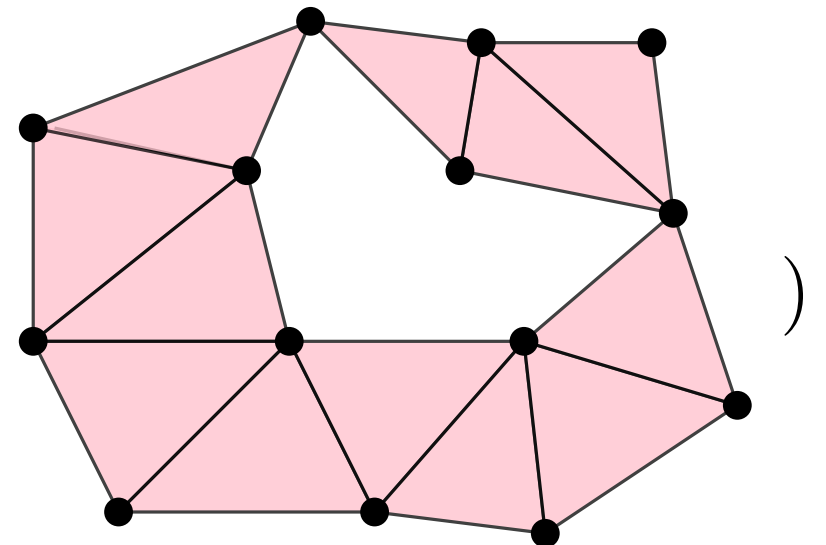


$$H_k = \{[C] : C \in Z_k\}$$

where

$$[C] = \{C' : C \sim C'\}$$

$$= \partial($$



# The homology groups

$H_k$  is a group (vector space) in which each element is an equivalence class of cycles associated to the same hole.

**Def:** The dimension of  $H_k$  is called the *Betti number*  $\beta_k$ .

Minimum number of (classes of) cycles needed to create a basis, i.e., to be able to write *any* cycle as a linear combination of cycles in the basis.

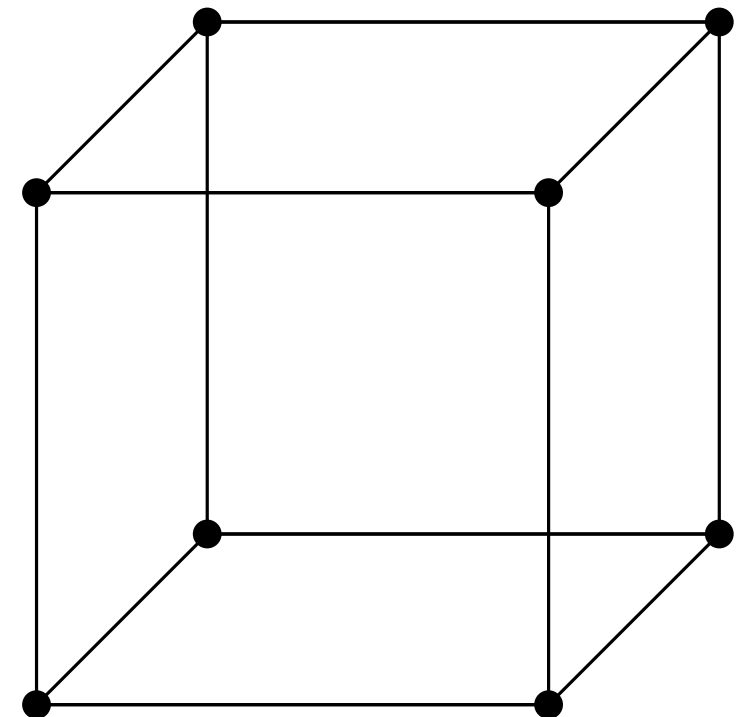
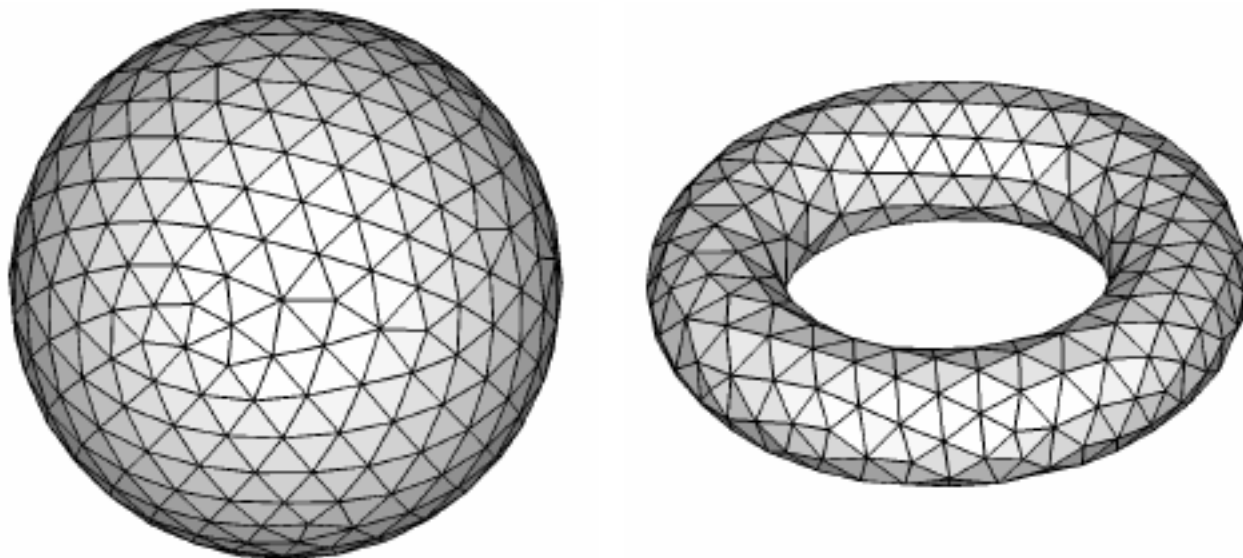
$\beta_0$  counts the connected components,  $\beta_1$  counts the loops,  $\beta_2$  counts the cavities, and so on...

# The homology groups

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**Q:** What are the Betti numbers of:



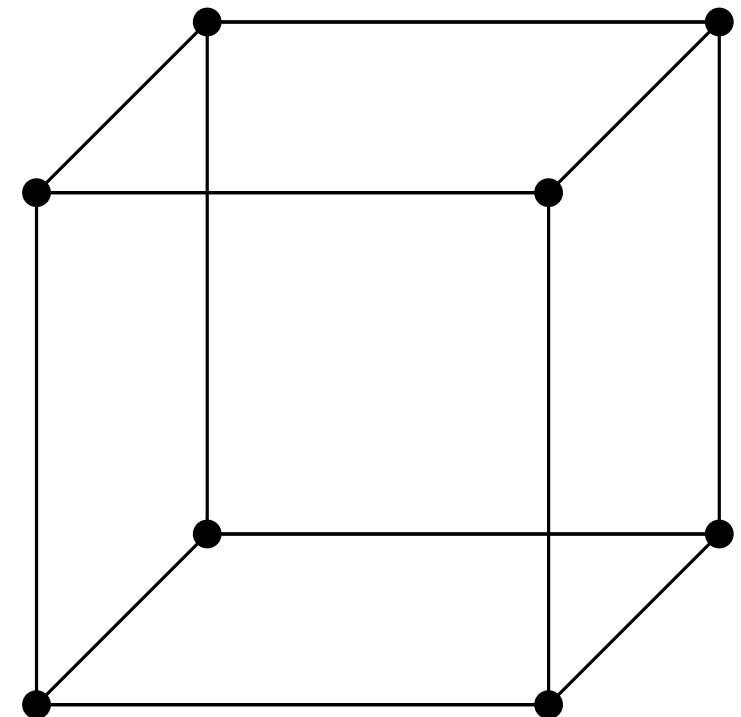
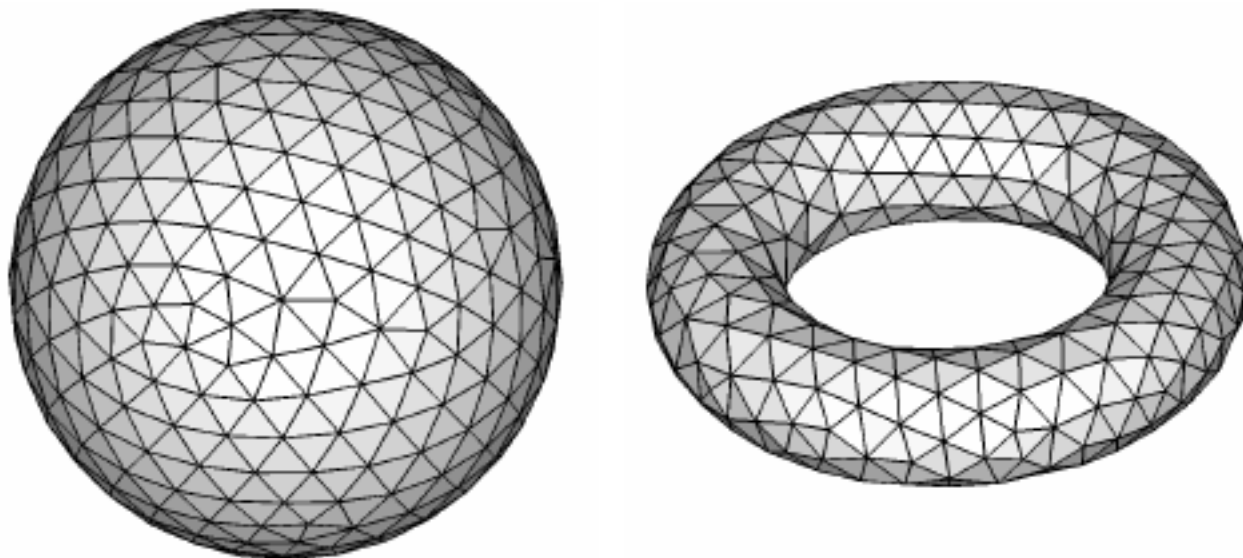


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The whole point of homology groups and Betti numbers is that they satisfy:

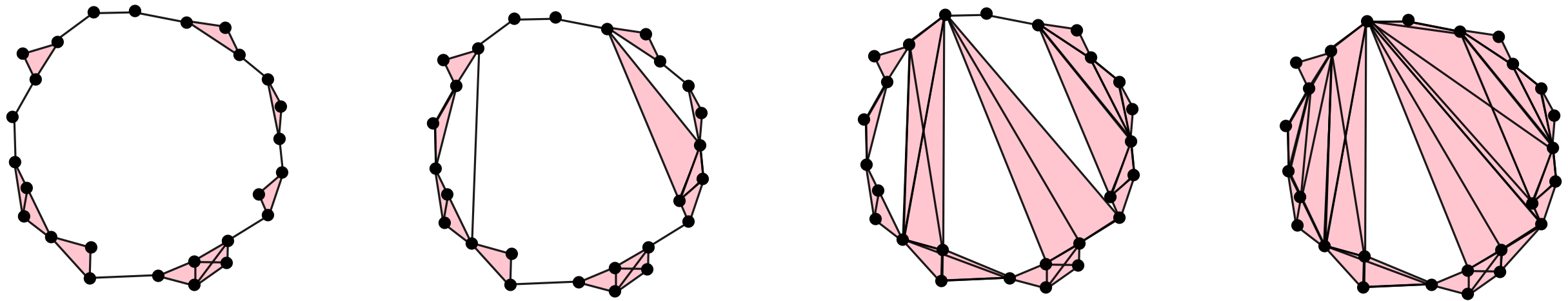
$$H_k(X) \not\cong H_k(Y) \implies X \not\cong Y$$

# Computation with filtrations and matrix reduction

Algorithms to compute the homology groups of a simplicial complex work by *decomposing* the simplicial complex, with a so-called *filtration*.

# Computation with filtrations and matrix reduction

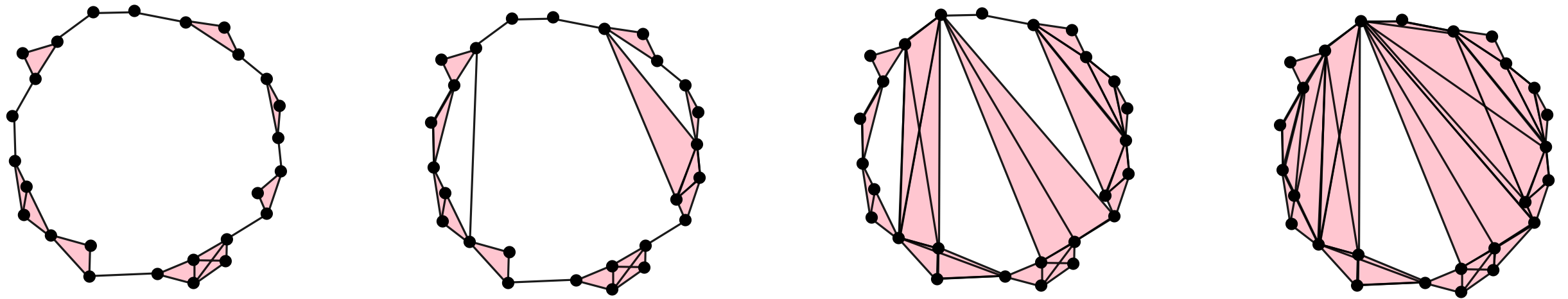
Algorithms to compute the homology groups of a simplicial complex work by *decomposing* the simplicial complex, with a so-called *filtration*.



**Def:** A **filtered simplicial complex**  $S$  is a family  $\{S_a\}_{a \in \mathbb{R}}$  of subcomplexes of some fixed simplicial complex  $S$  s.t.  $S_a \subseteq S_b$  for any  $a \leq b$ .

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**Def:** Let  $f$  be a real valued function defined on the vertices of  $K$ . For  $\sigma = [v_0, \dots, v_k] \in K$ , let  $f(\sigma) = \max_{i=0, \dots, k} f(v_i)$ , and order the simplices of  $K$  in increasing order w.r.t. the function  $f$  values (and break ties with dimension in case some simplices have the same function value).

**Q:** Show that this is a filtration.

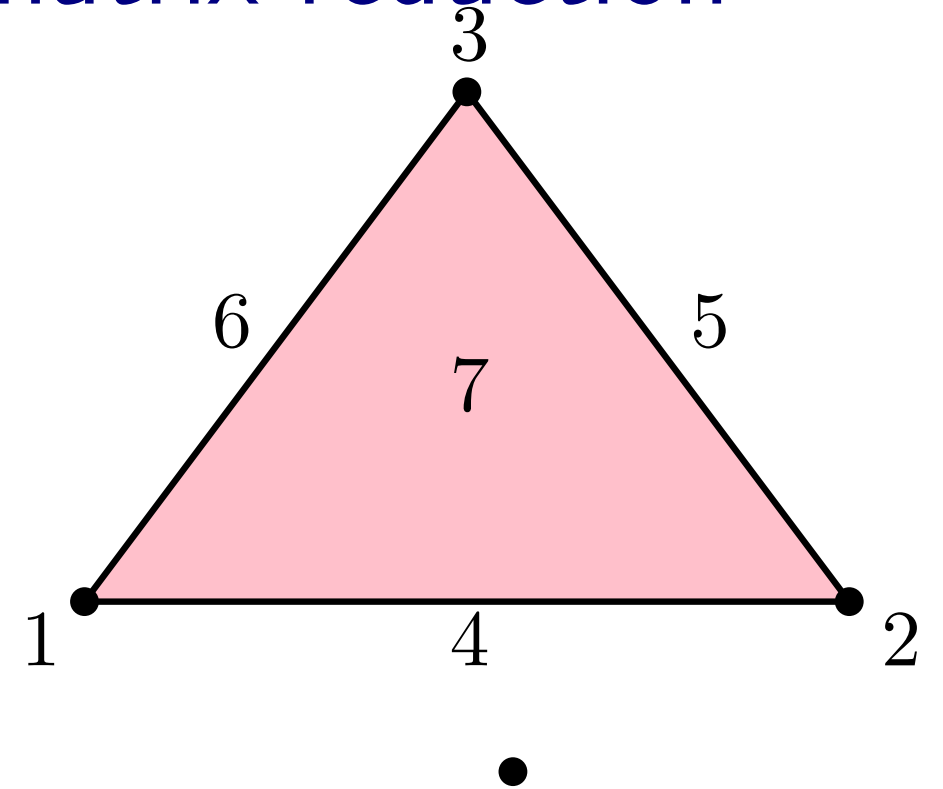
# Computation with filtrations and matrix reduction

**Input:** simplicial filtration

Homology can be computed by using the fact that each simplex is either:

*positive*, i.e., it *creates a new homology class*

*negative*, i.e., it *destroys an homology class*



•  
1

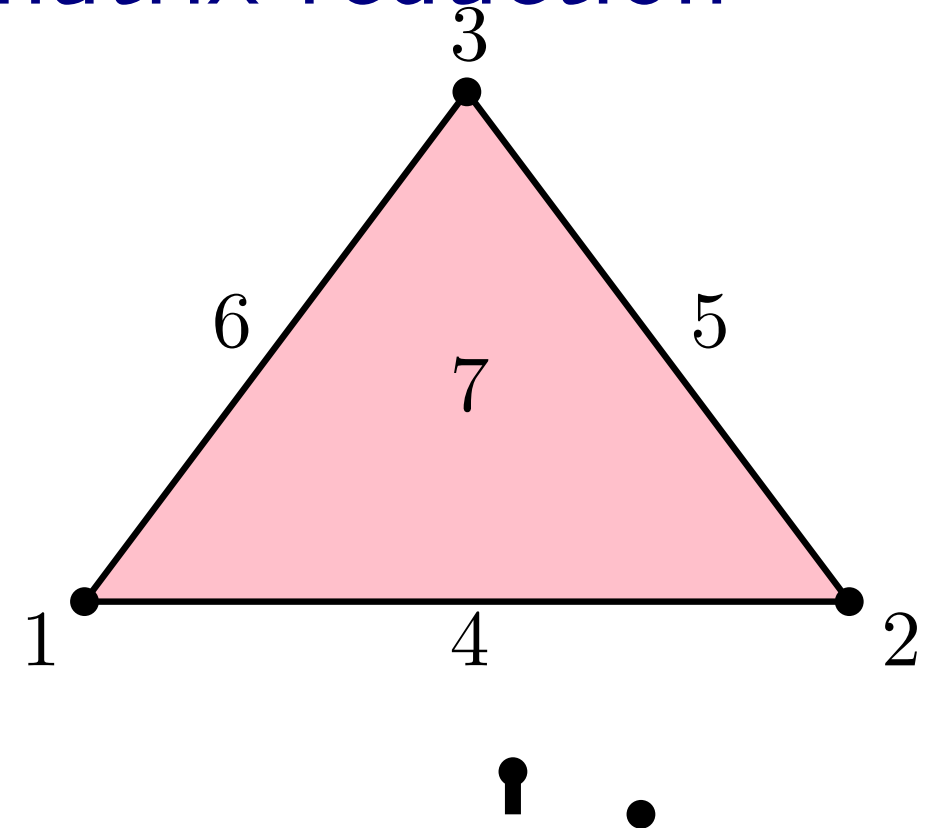
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•  
1

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1

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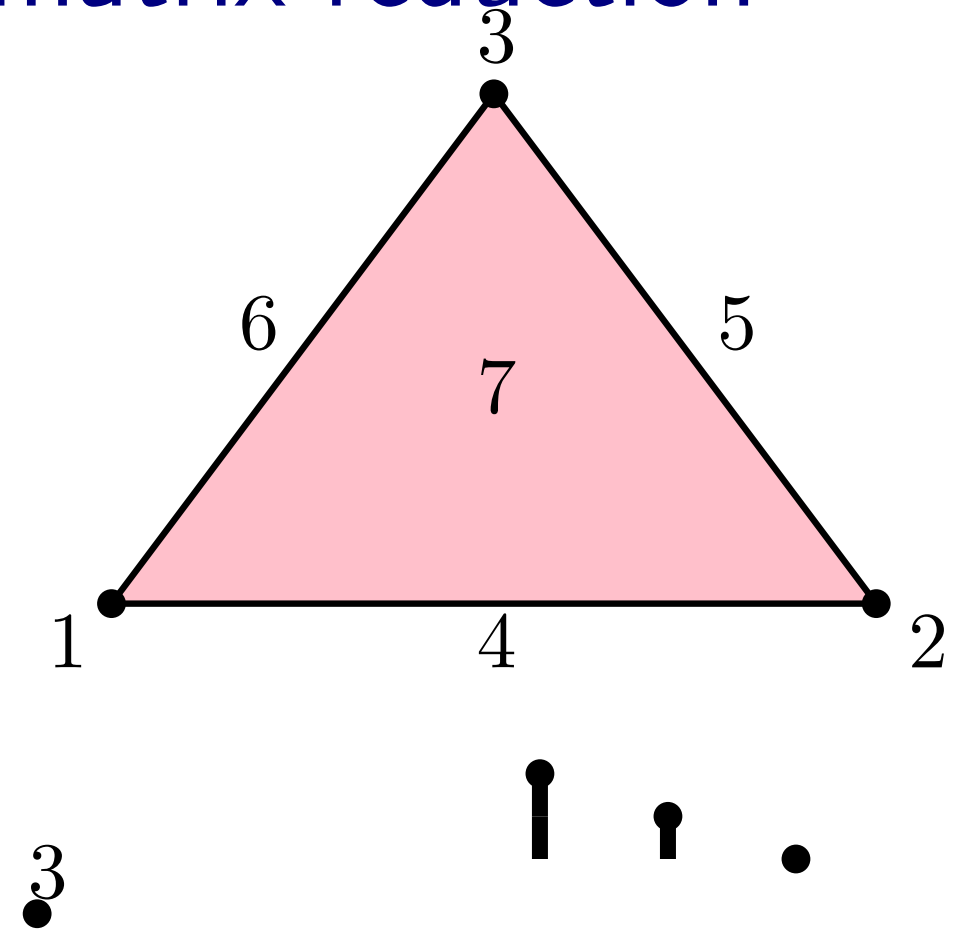
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1

1

2

1

2

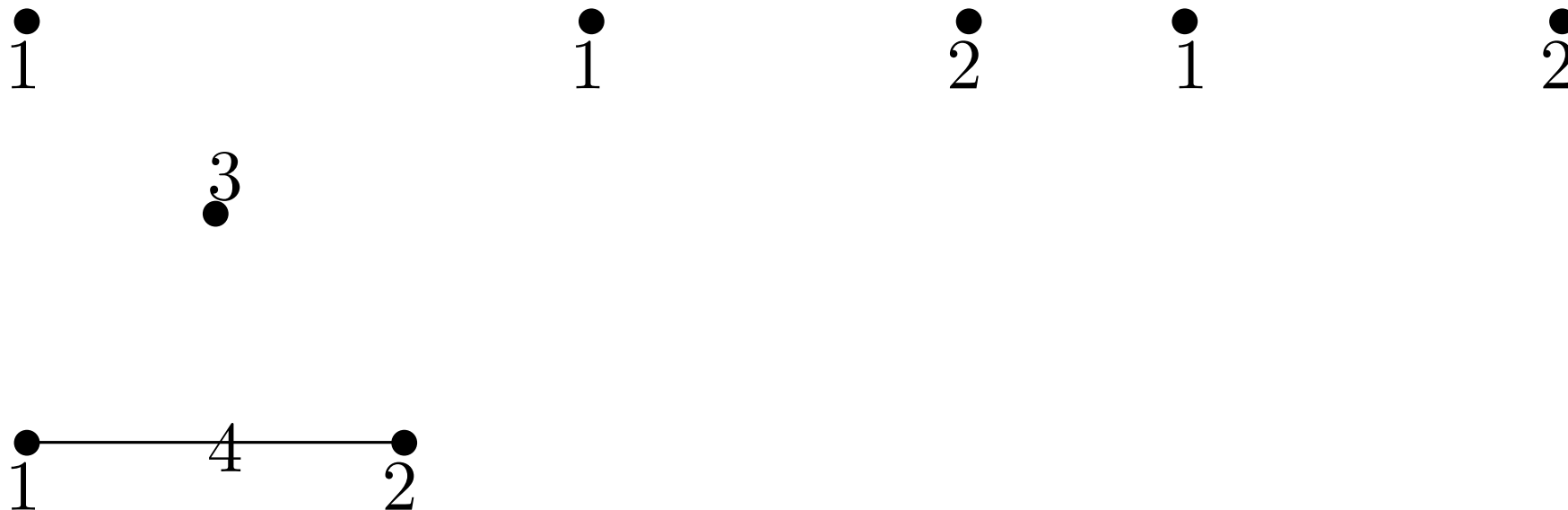
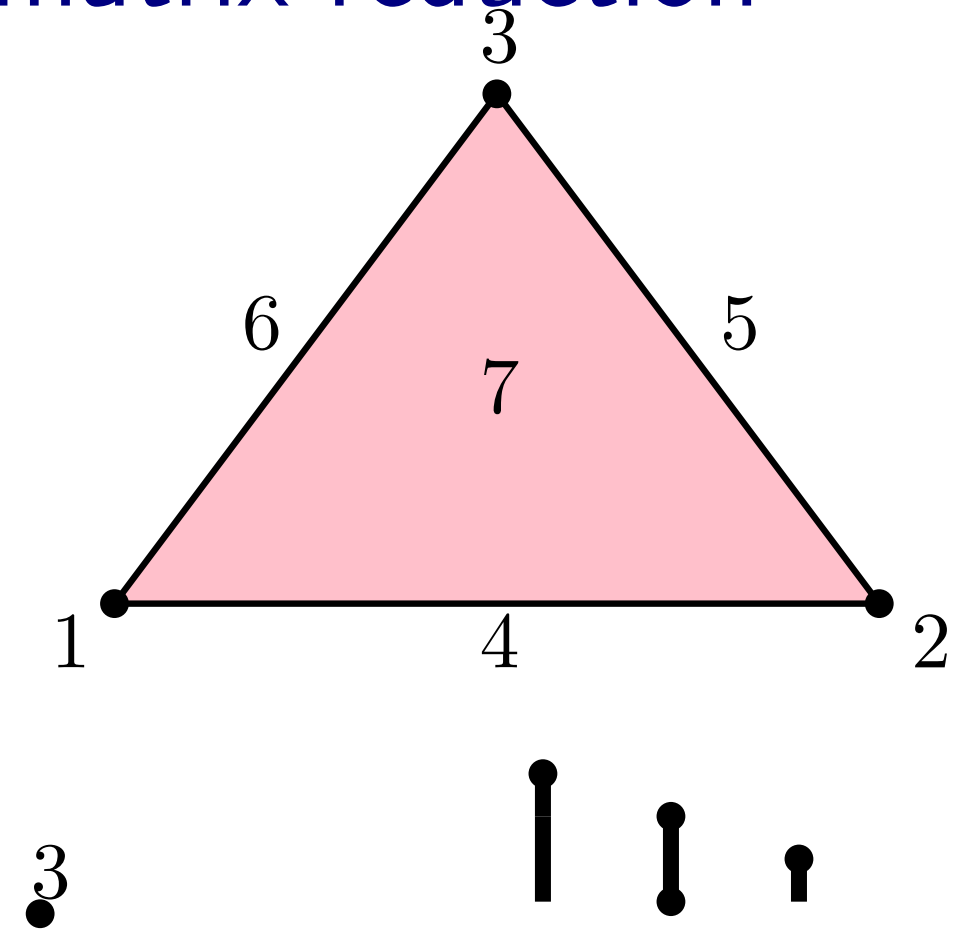
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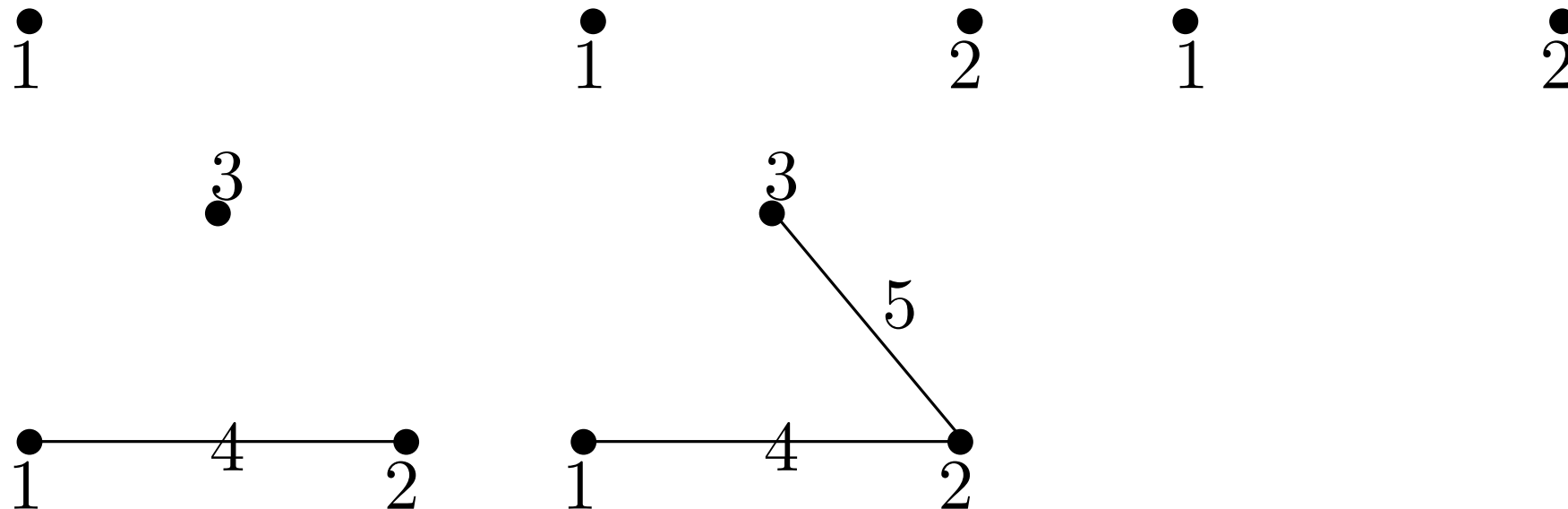
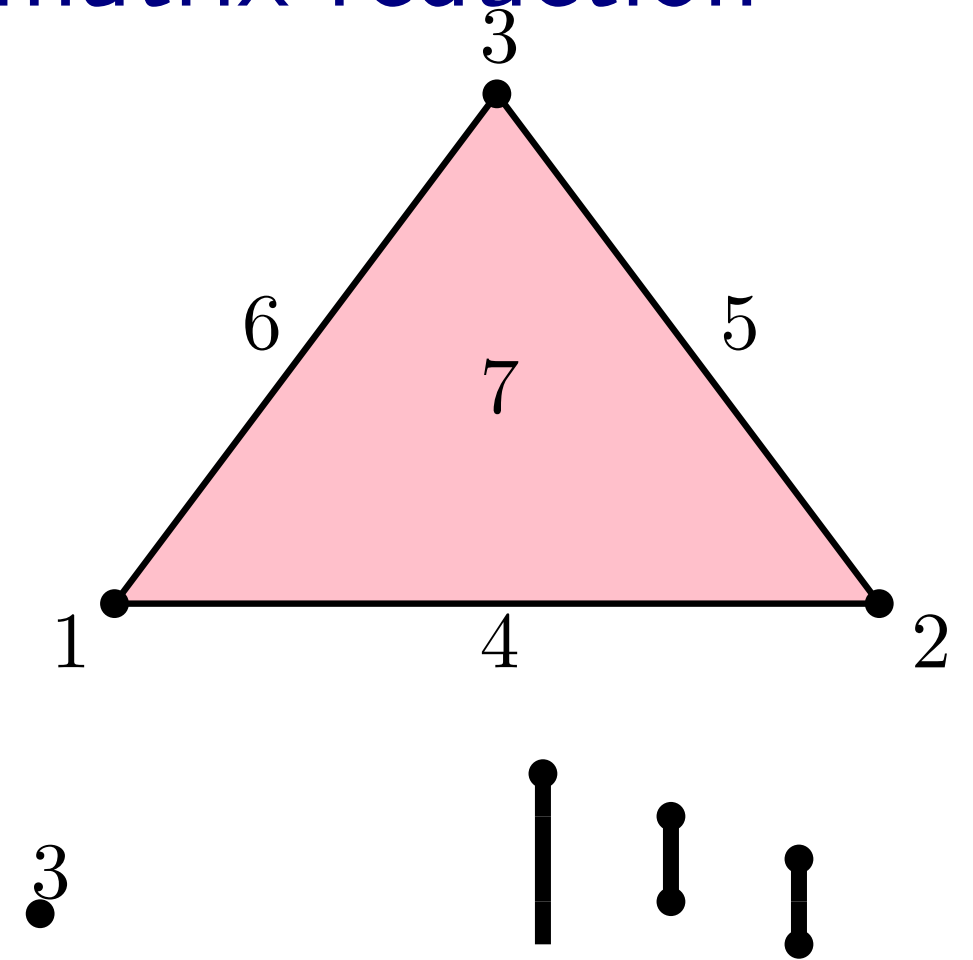
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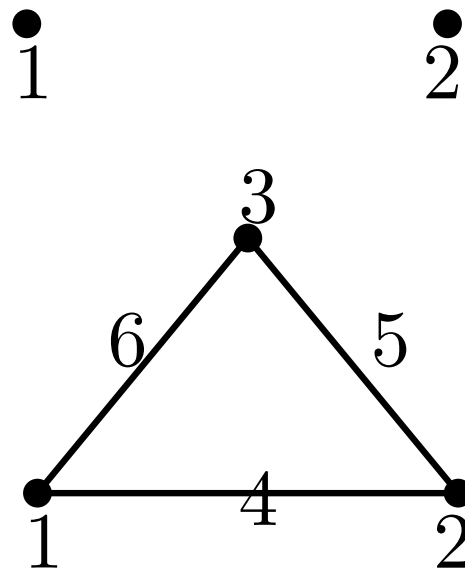
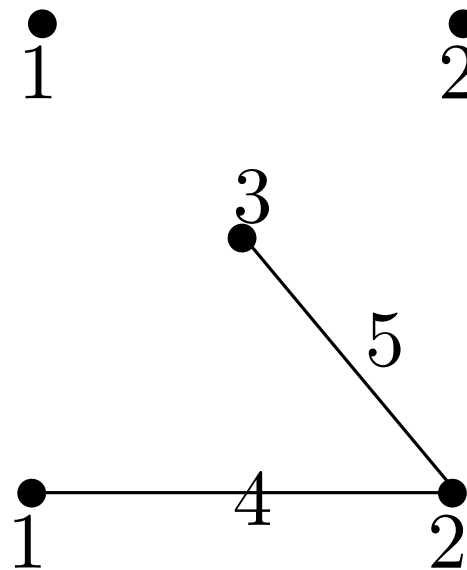
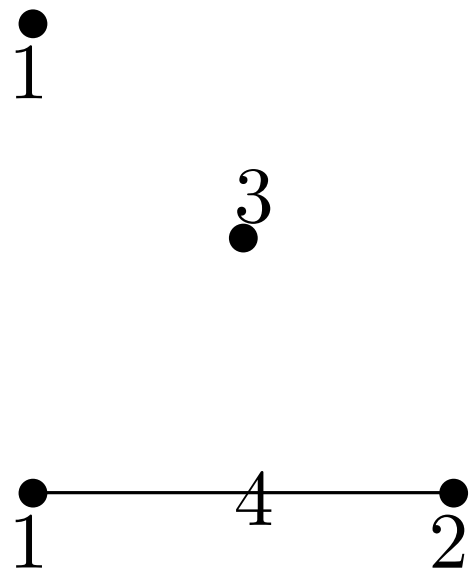
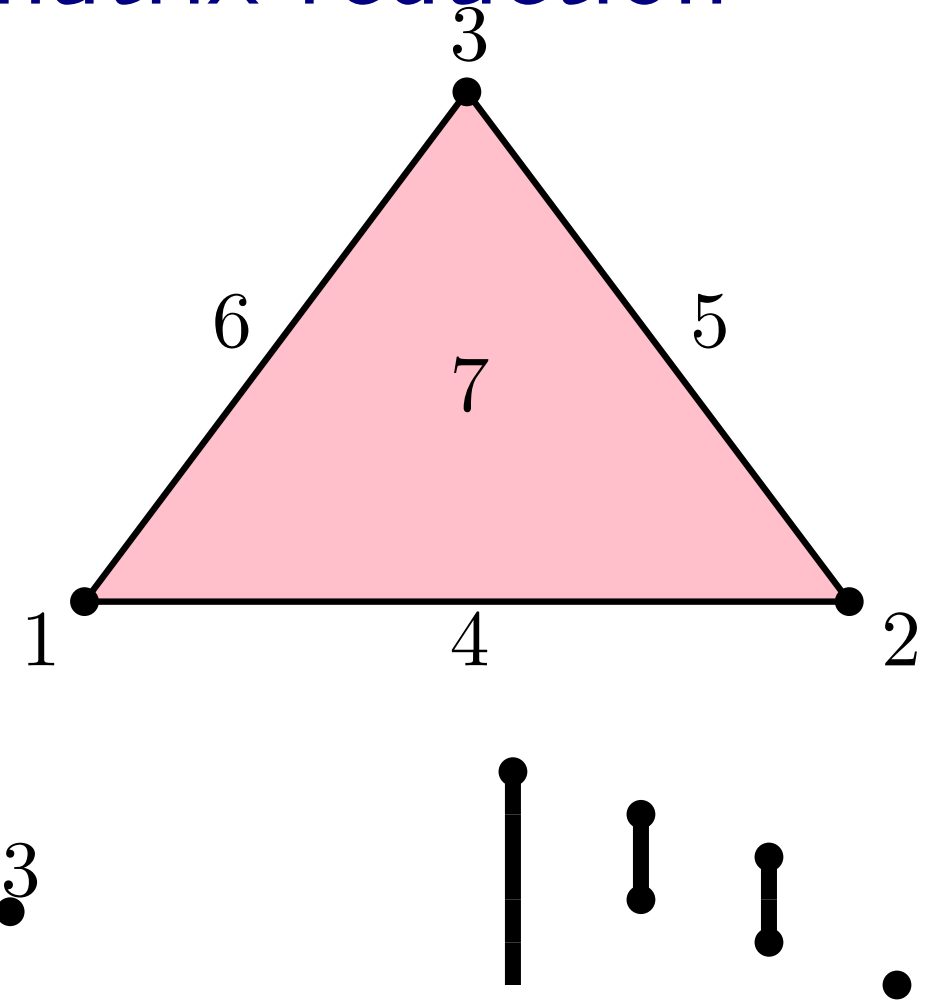
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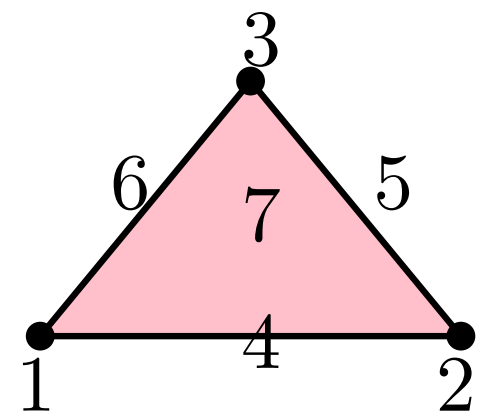
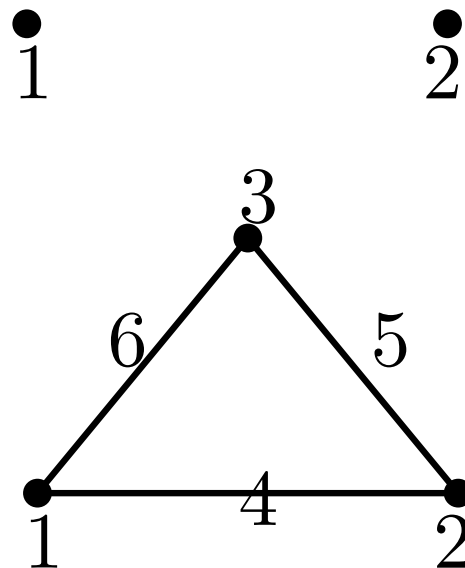
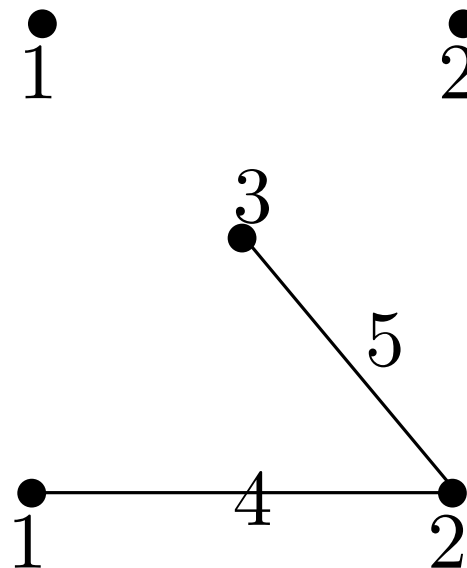
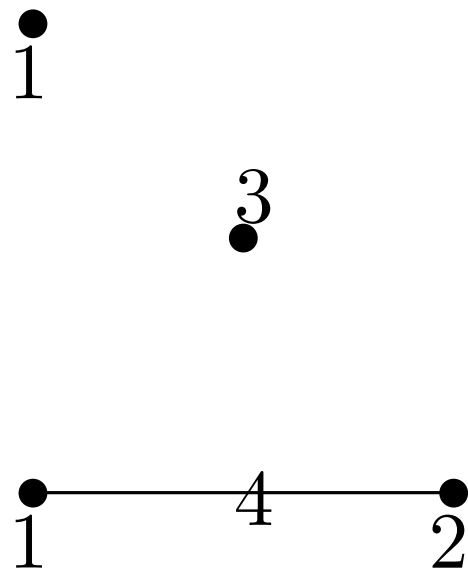
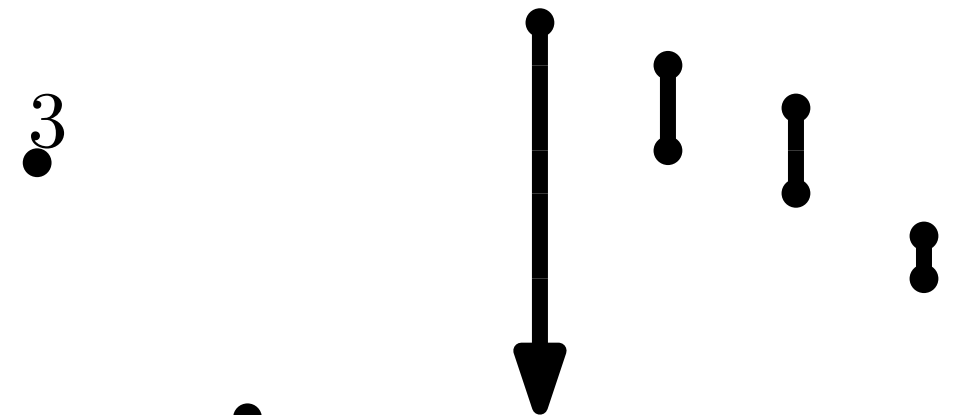
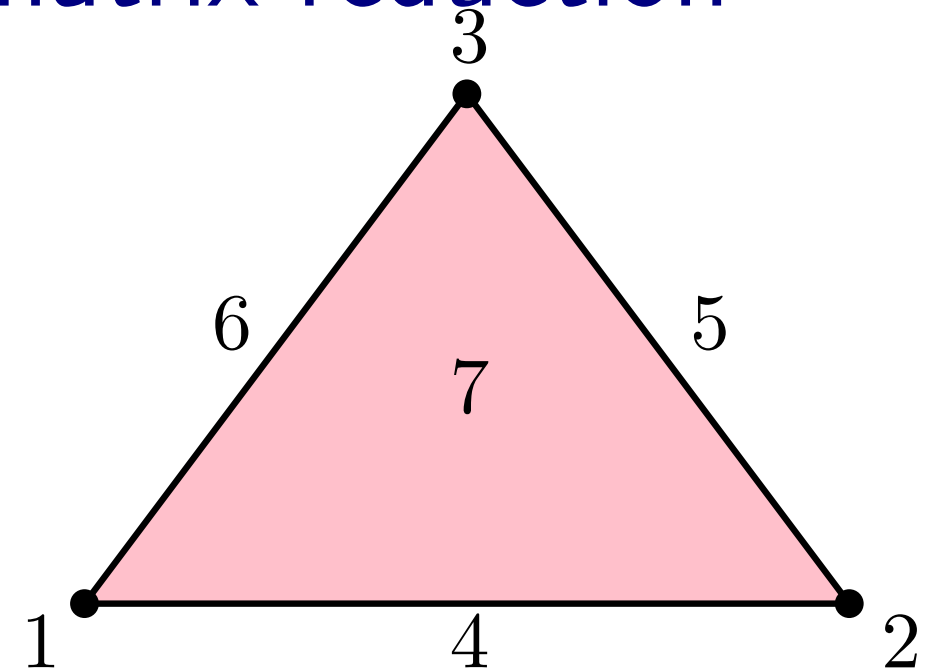
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# Computation with filtrations and matrix reduction

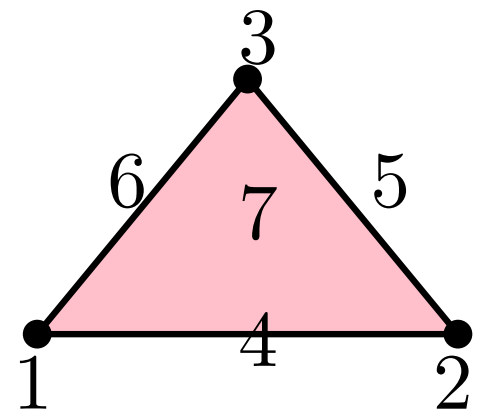
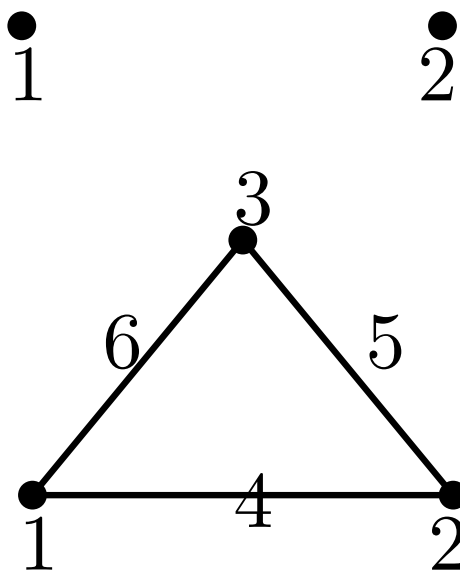
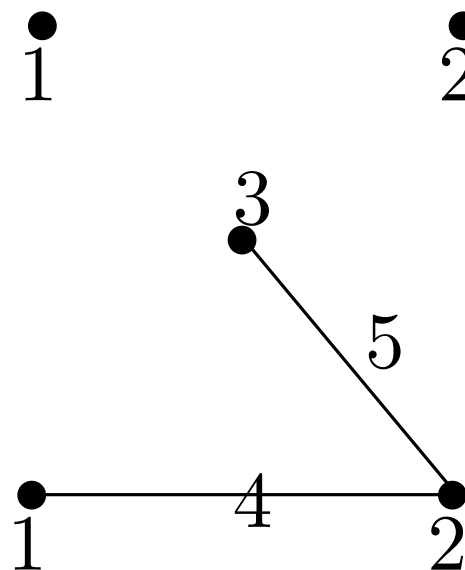
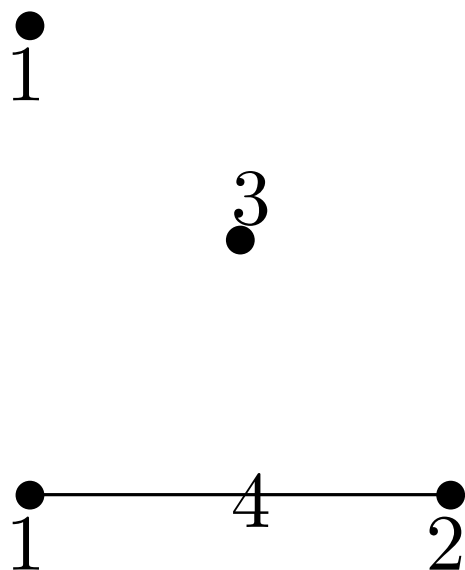
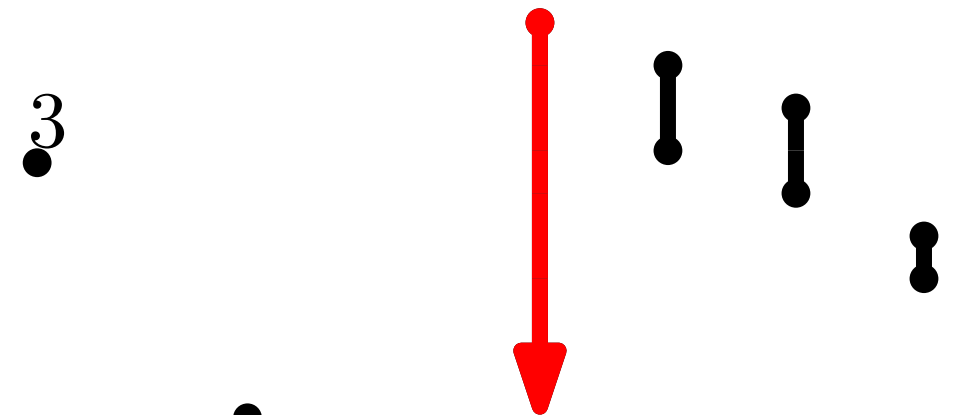
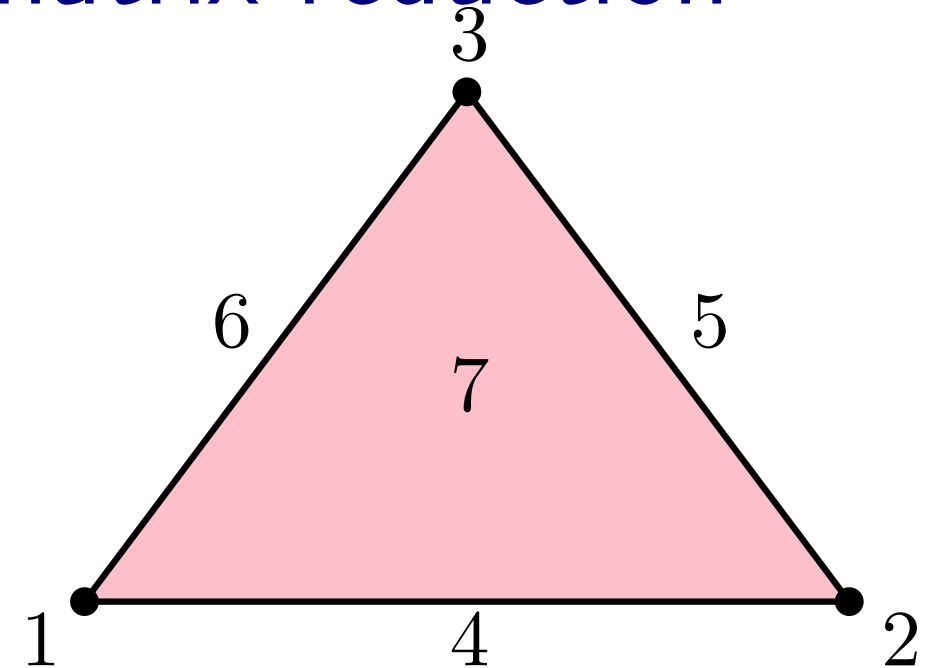
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The Betti number is equal to the number of bars that are still alive when the full complex is reached in the filtration



# Computation with filtrations and matrix reduction

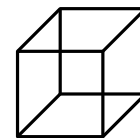
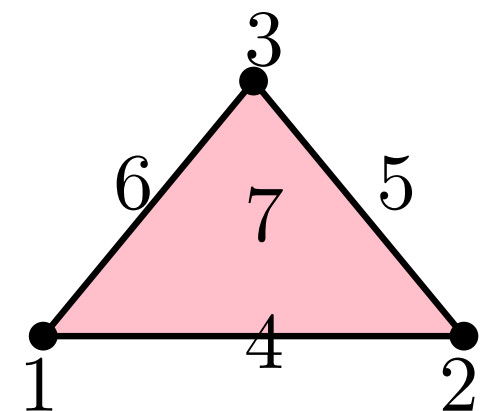
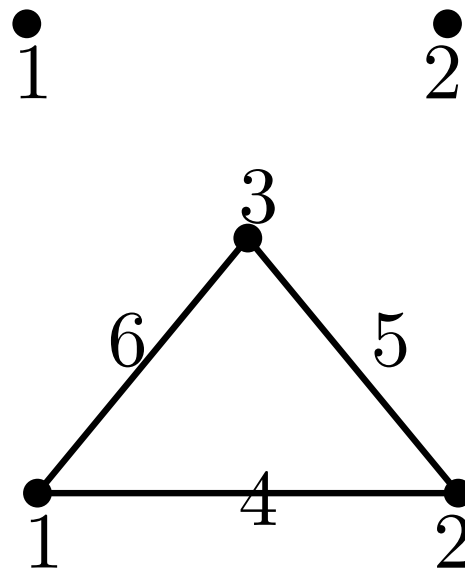
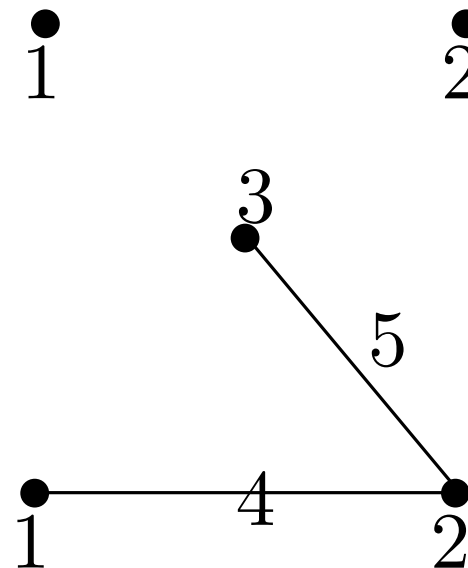
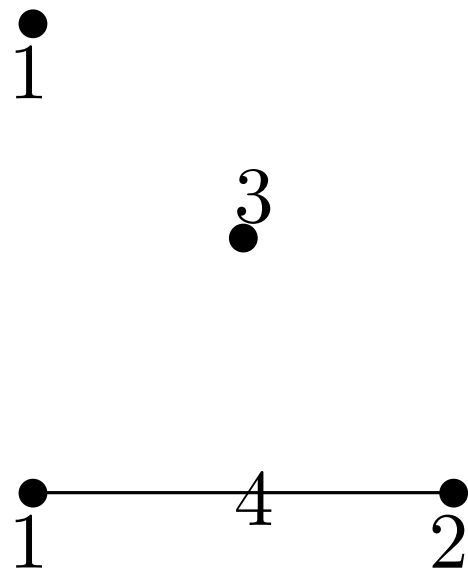
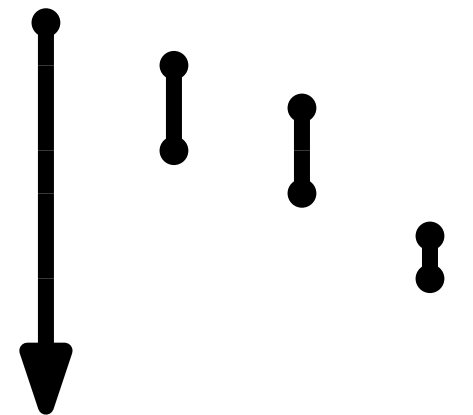
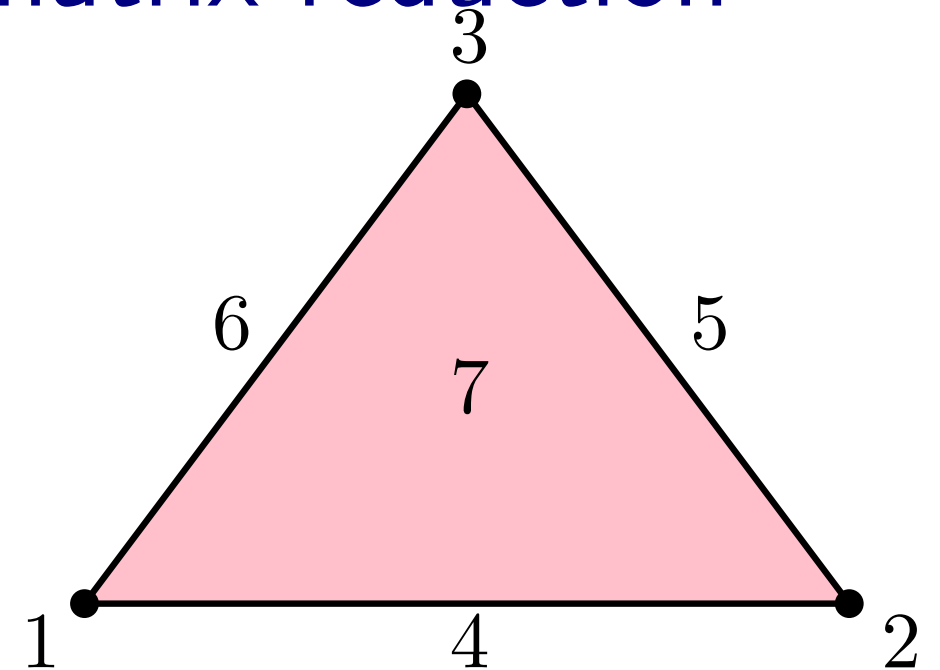
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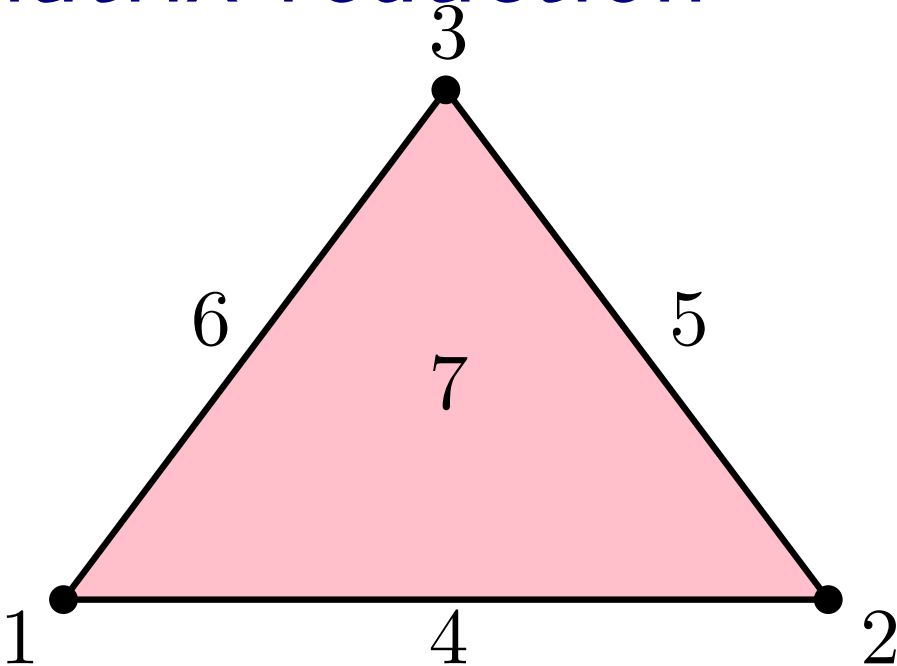
**Q:** Do the same for the homology of the cube.



# Computation with filtrations and matrix reduction

**Input:** simplicial filtration  
given as *boundary matrix*

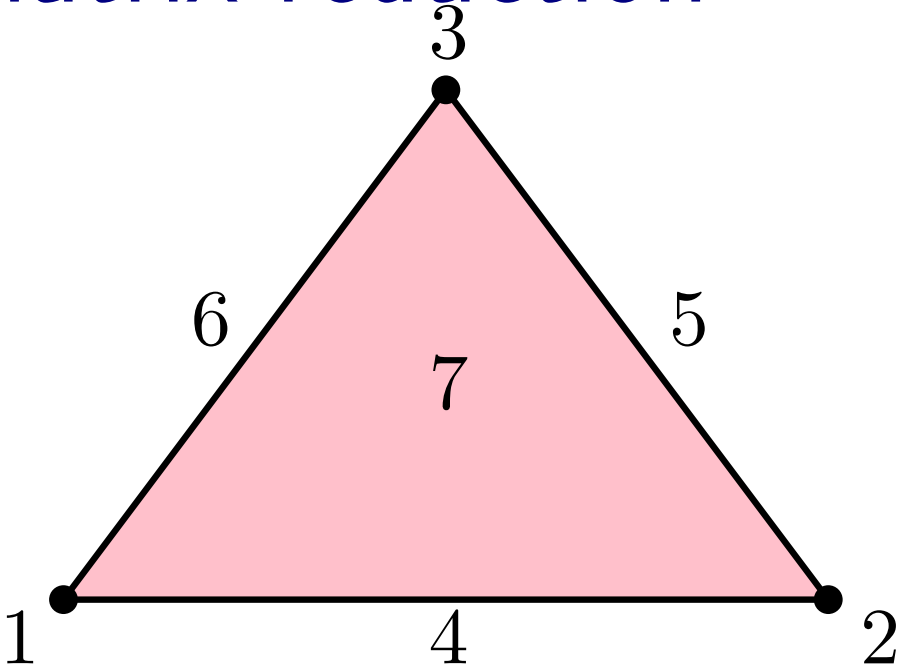
	1	2	3	4	5	6	7
1							
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**Input:** simplicial filtration  
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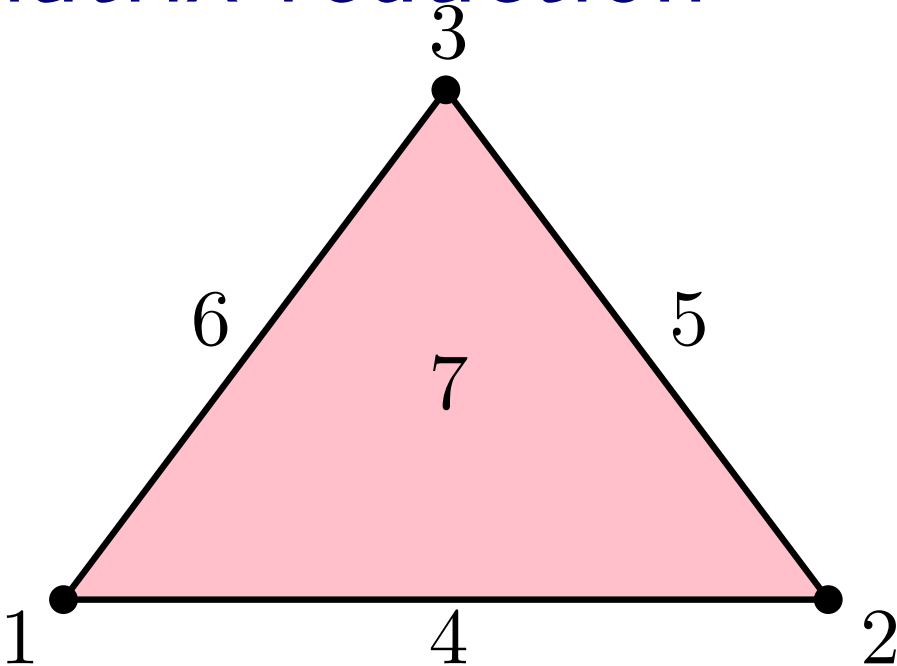
	1	2	3	4	5	6	7
1				•			
2				•			
3							
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5							
6							
7							



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**Input:** simplicial filtration  
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	1	2	3	4	5	6	7
1				•			
2				•	•		
3					•		
4							
5							
6							
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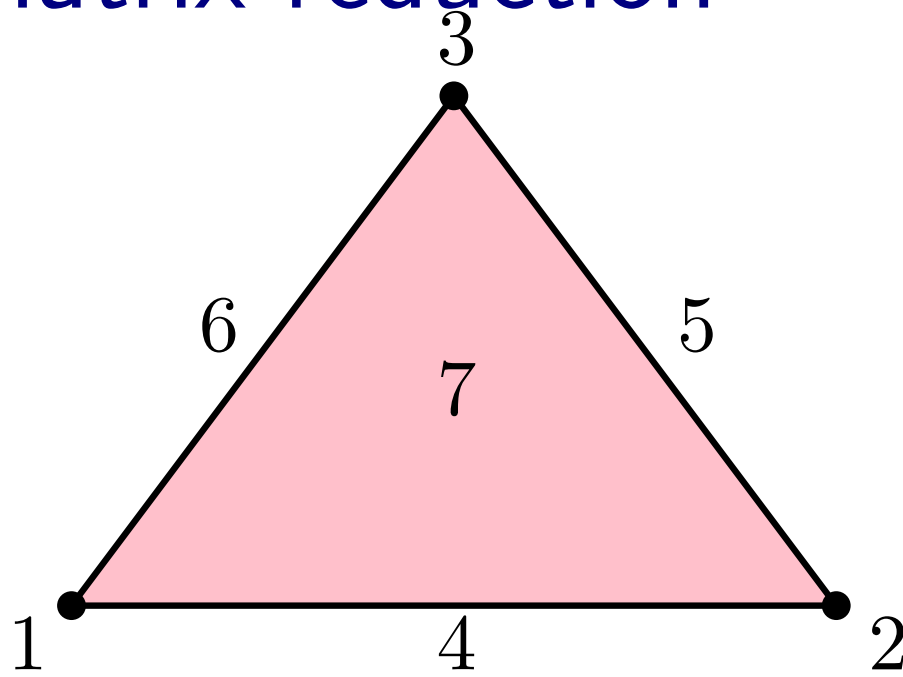




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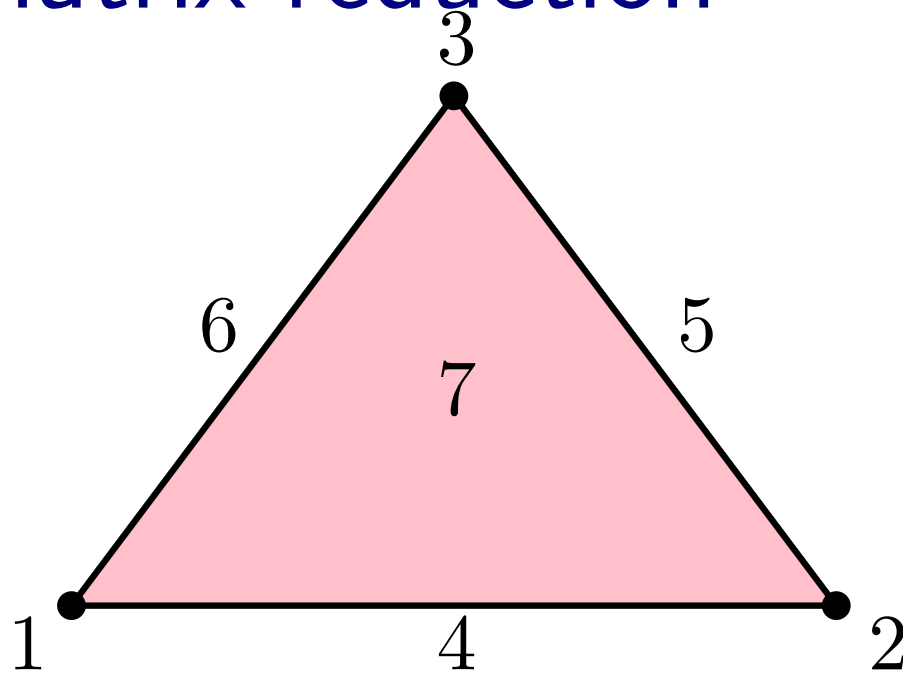
	1	2	3	4	5	6	7
1				•		•	
2				•	•		
3					•	•	
4							
5							
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7							



# Computation with filtrations and matrix reduction

**Input:** simplicial filtration  
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	1	2	3	4	5	6	7
1				•		•	
2				•	•		
3					•	•	
4							•
5							•
6							•
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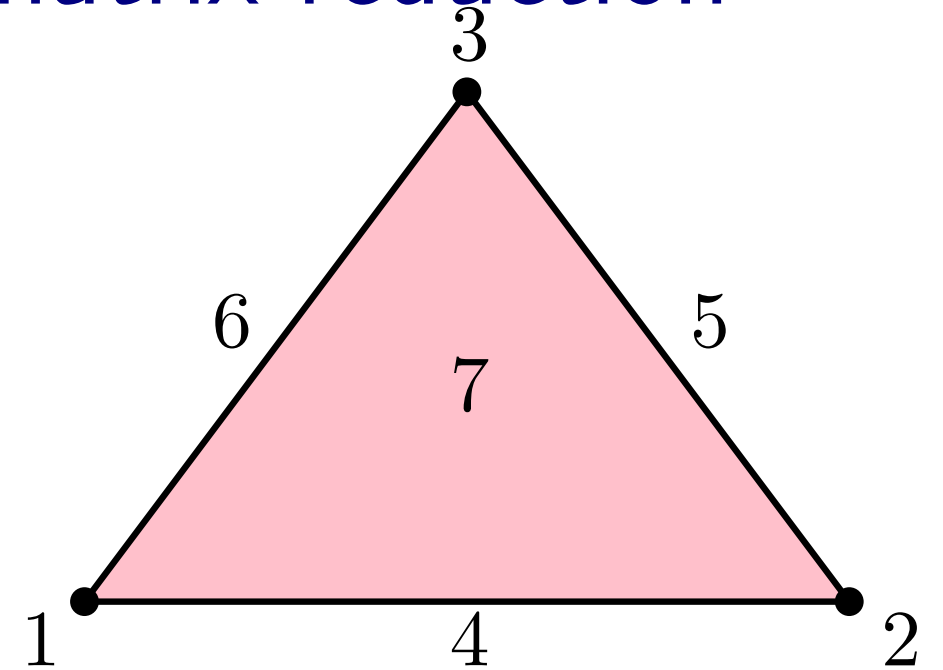


# Computation with filtrations and matrix reduction

**Input:** simplicial filtration

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	1	2	3	4	5	6	7
1				•		•	
2				•	•		
3					•	•	
4							•
5							•
6							•
7							



for  $j=1$  to  $m$  do:

while  $\exists k < j$  s.t.  $\text{low}(k) == \text{low}(j)$  do:

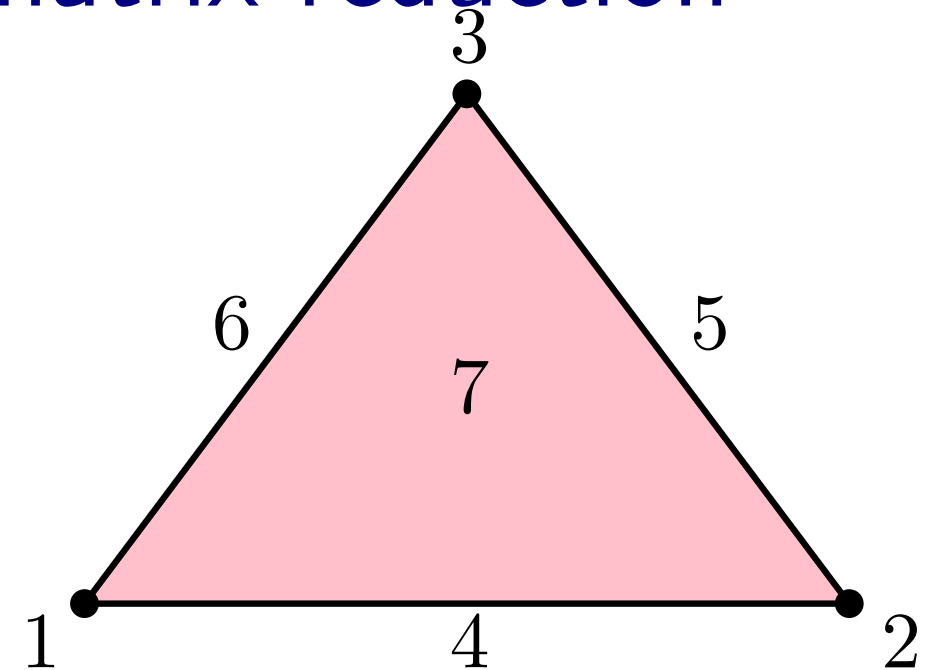
$\text{col}(j) = \text{col}(j) + \text{col}(k)$

# Computation with filtrations and matrix reduction

**Input:** simplicial filtration

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	1	2	3	4	5	6	7
1				•		•	
2				•	•		
3					•	•	
4							•
5							•
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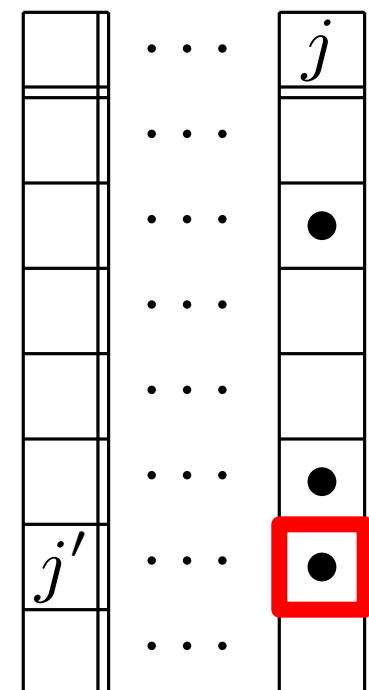


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$\text{low}(j) = j'$



# Computation with filtrations and matrix reduction

**Input:** simplicial filtration

given as *boundary matrix*

	1	2	3	4	5	6	7
1				•		•	
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3					•	•	
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•	•

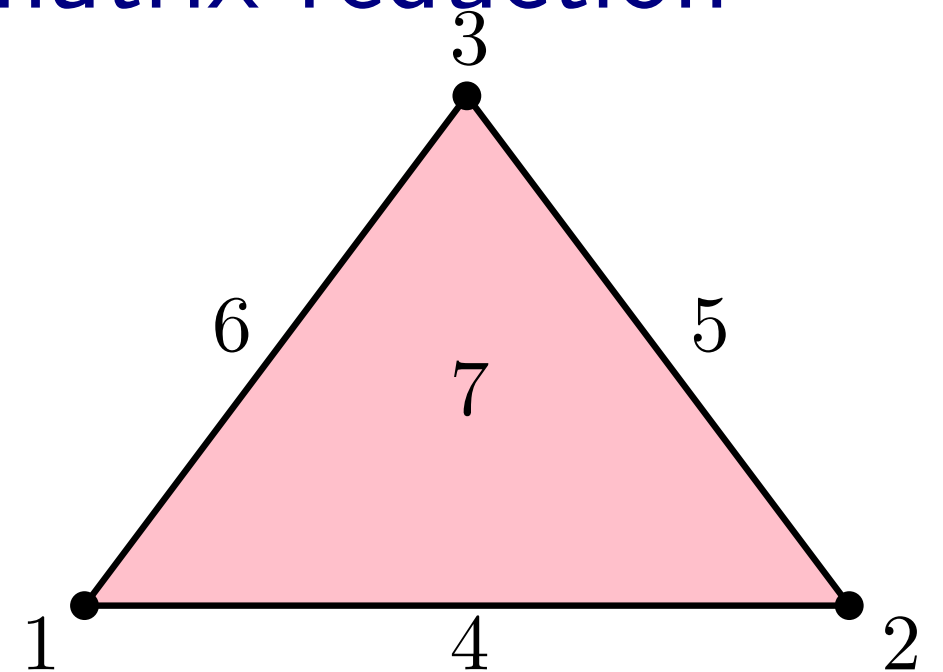
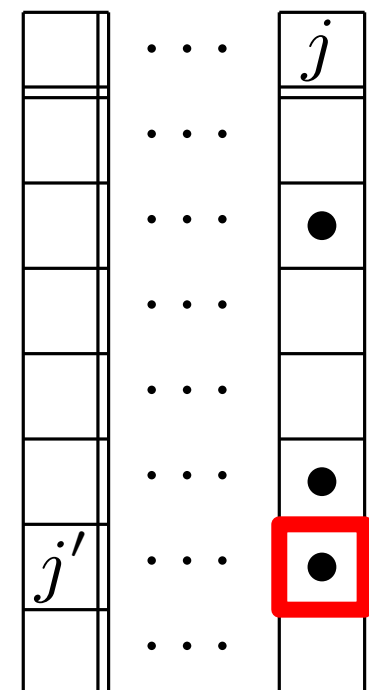
$$6 = 6 + 5$$

for  $j=1$  to  $m$  do:

while  $\exists k < j$  s.t.  $\text{low}(k) == \text{low}(j)$  do:

$$\text{col}(j) = \text{col}(j) + \text{col}(k)$$

$$\text{low}(j) = j'$$



# Computation with filtrations and matrix reduction

**Input:** simplicial filtration  
 given as *boundary matrix*

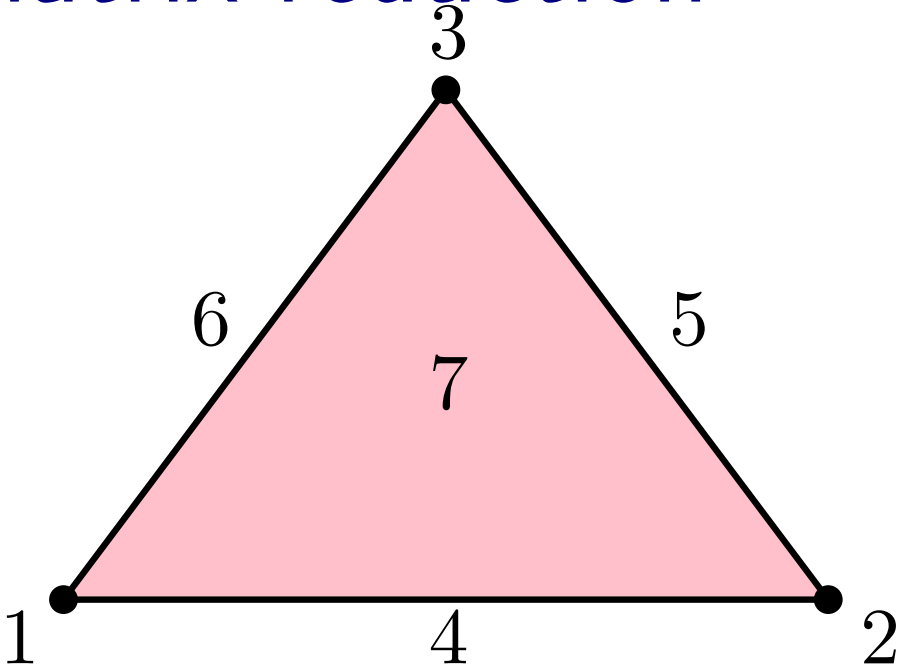
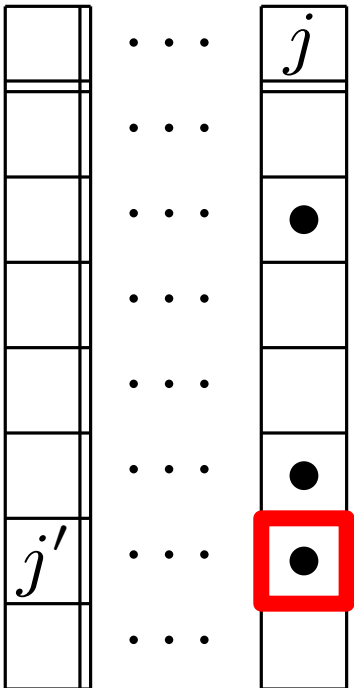
	1	2	3	4	5	6	7
1				•		•	
2				•	•	•	
3					•		
4							•
5							•
6							•
7							

5	6
	•
•	•
•	

$$6 = 6+5$$

for j=1 to m do:  
 while  $\exists k < j$  s.t.  $\text{low}(k) == \text{low}(j)$  do:  
 $\text{col}(j) = \text{col}(j) + \text{col}(k)$

$$\text{low}(j) = j'$$



# Computation with filtrations and matrix reduction

**Input:** simplicial filtration

given as *boundary matrix*

	1	2	3	4	5	6	7
1				•		•	
2				•	•	•	
3					•		
4							•
5							•
6							•
7							

5	6
	•
•	•
•	

4		6
•		•
•		•

$$6 = 6 + 5$$

$$6 = 6 + 4$$

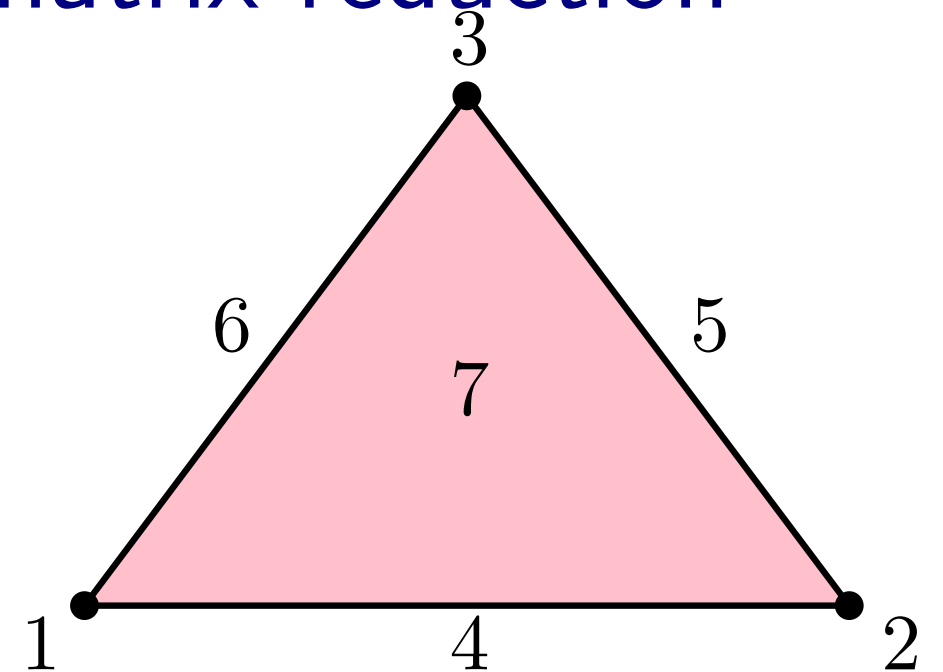
for  $j=1$  to  $m$  do:

while  $\exists k < j$  s.t.  $\text{low}(k) == \text{low}(j)$  do:

$$\text{col}(j) = \text{col}(j) + \text{col}(k)$$

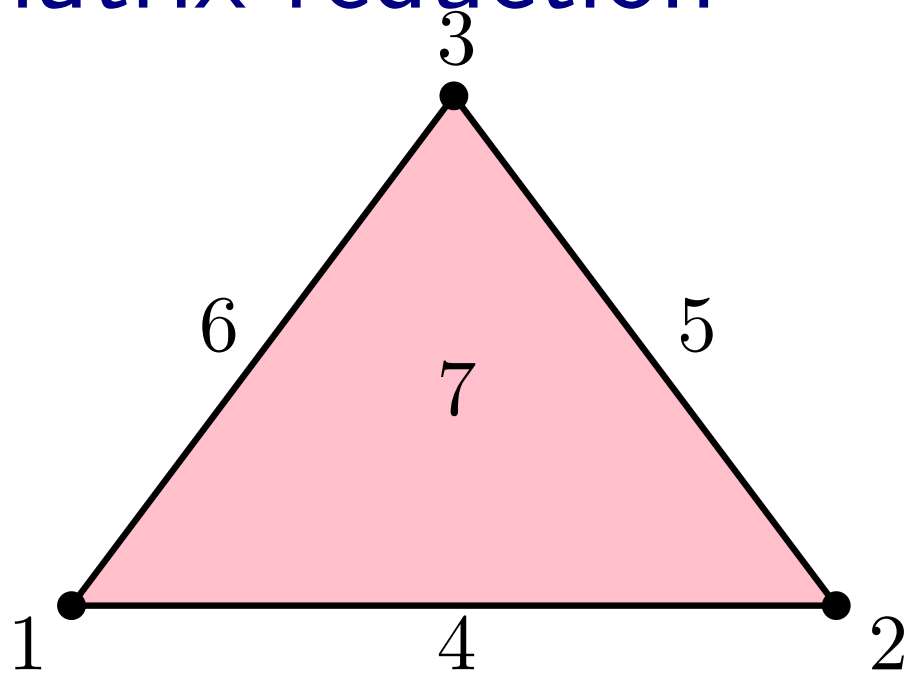
$$\text{low}(j) = j'$$

	...	$j$
	...	
	...	•
	...	
	...	
	...	•
$j'$	...	•
	...	



# Computation with filtrations and matrix reduction

**Input:** simplicial filtration  
given as *boundary matrix*



	1	2	3	4	5	6	7
1				•			
2				•	•		
3					•		
4							•
5							•
6							•
7							

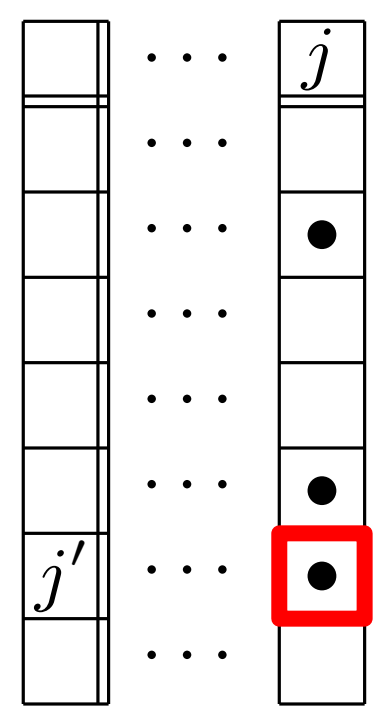
for  $j=1$  to  $m$  do:  
  while  $\exists k < j$  s.t.  $\text{low}(k) == \text{low}(j)$  do:  
     $\text{col}(j) = \text{col}(j) + \text{col}(k)$

5	6
	•
•	•
•	

4		6
•		
•		

$6 = 6 + 5$   
 $6 = 6 + 4$

$\text{low}(j) = j'$

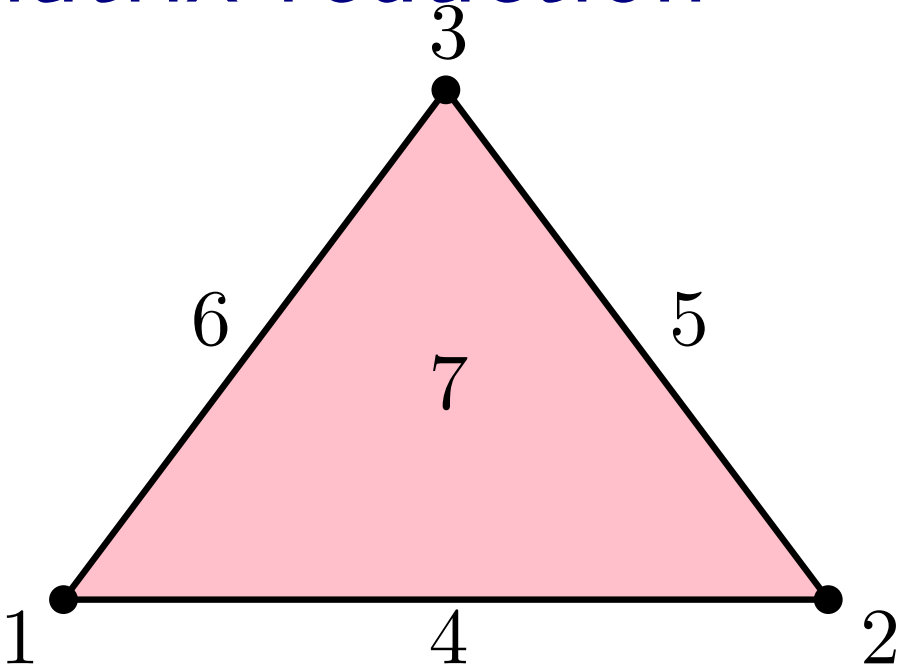




# Computation with filtrations and matrix reduction

**Input:** simplicial filtration

Output: boundary matrix

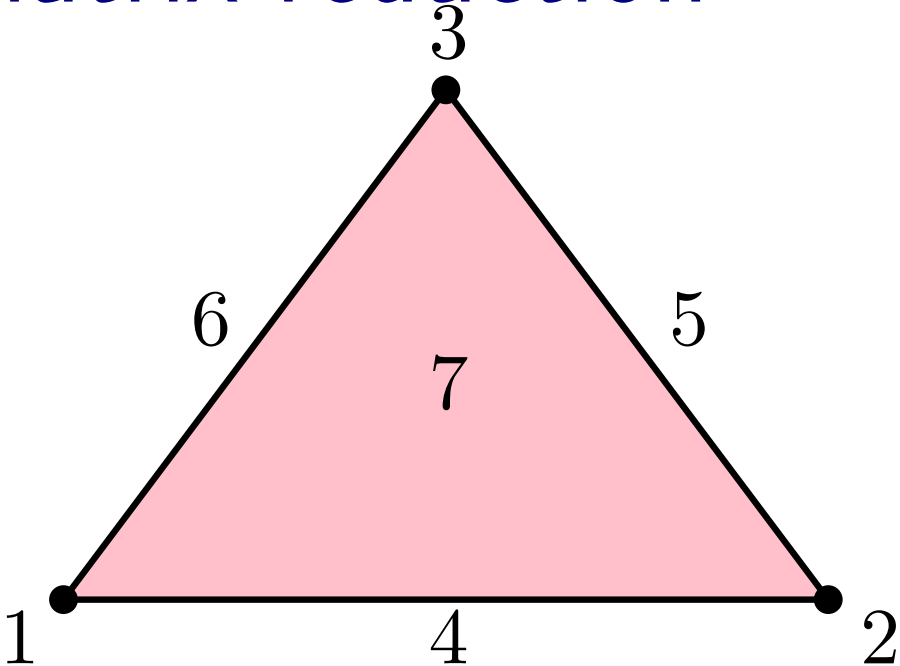


	1	2	3	4	5	6	7
1				*		*	
2				*	*		
3					*	*	
4							*
5							*
6							*
7							

# Computation with filtrations and matrix reduction

**Input:** simplicial filtration

Output: boundary matrix  
reduced to column-echelon form



	1	2	3	4	5	6	7
1				*		*	
2				*	*		
3					*	*	
4							*
5							*
6							*
7							

	1	2	3	4	5	6	7
1				*			
2				1	*		
3					1		
4							*
5							*
6							1
7							

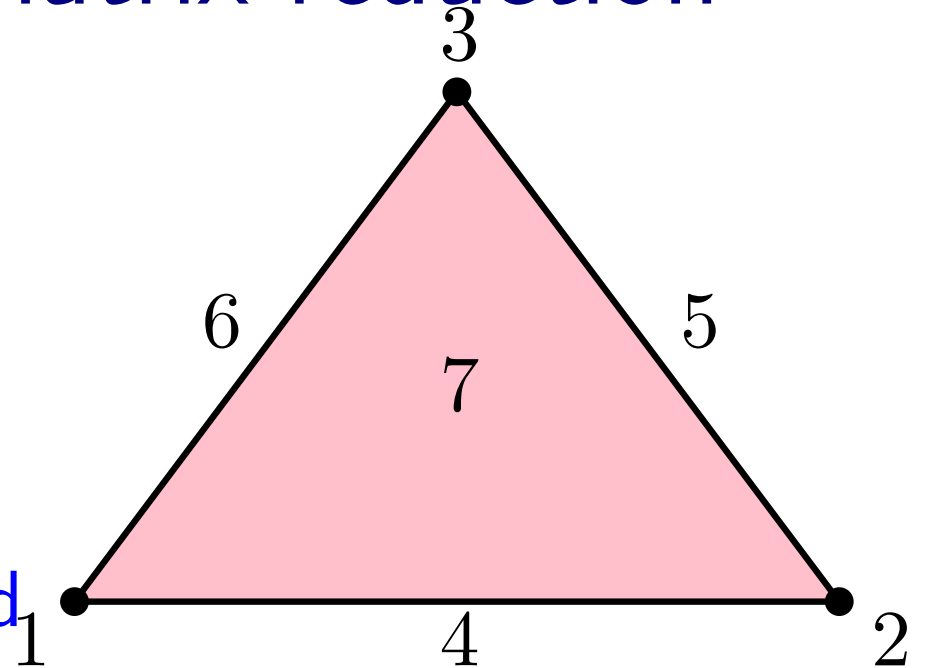
# Computation with filtrations and matrix reduction

**Input:** simplicial filtration

Output: boundary matrix  
reduced to column-echelon form

○ some positive-negative simplices are paired  
[2, 4), [3, 5), [6, 7)

□ unpaired simplices provide homology basis:  $[1, +\infty)$



	1	2	3	4	5	6	7
1				*		*	
2				*	*		
3					*	*	
4							*
5							*
6							*
7							

	1	2	3	4	5	6	7
1				*			
2				1	*		
3					1		
4							*
5							*
6							1
7							

# Computation with filtrations and matrix reduction

**Input:** simplicial filtration

Output: boundary matrix  
reduced to column-echelon form

**Q:** Complexity?

# Computation with filtrations and matrix reduction

**Input:** simplicial filtration

Output: boundary matrix  
reduced to column-echelon form

**Q:** Complexity?

## **PLU factorization:**

- Gaussian elimination
- fast matrix multiplication (divide-and-conquer)
- random projections?

# Computation with filtrations and matrix reduction

**Input:** simplicial filtration

Output: boundary matrix  
reduced to column-echelon form

**Q:** Complexity?

## PLU factorization:

- Gaussian elimination
  - PLEX / JavaPLEX (<http://appliedtopology.github.io/javaplex/>)
  - Dionysus (<http://www.mrzv.org/software/dionysus/>)
  - Perseus (<http://www.sas.upenn.edu/~vnanda/perseus/>)
  - Gudhi (<http://gudhi.gforge.inria.fr/>)
  - PHAT (<https://bitbucket.org/phat-code/phat>)
  - DIPHA (<https://github.com/DIPHA/dipha/>)
  - CTL (<https://github.com/appliedtopology/ctl>)

# Computation with filtrations and matrix reduction

**Q:** Triangulate and compute homology of dunce cap:

