

# Persistent homology of spaces and groups

Graham Ellis

## Outline

1. Introduction to persistence bar codes  
(three motivating examples)
2. Computation of persistence bar codes  
(discrete vector fields & contracting homotopies)
3. Potential application to group cohomology

Mathematics Algorithms Proofs, 8-12 November 2010

## Motivating Example I: statistical data analysis

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For instance,  $S$  sampled from  $M \subset \mathbb{R}^2$ .

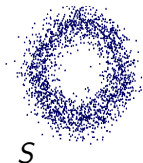


## One approach to data analysis

Repeatedly “thicken” the set  $S$  to produce a sequence of inclusions

$$S = S_1 \subset S_2 \subset S_3 \subset \cdots .$$

Then search for “persistent” topological features in the sequence.

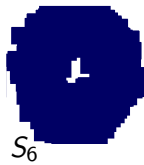
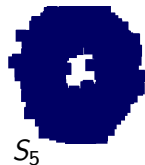


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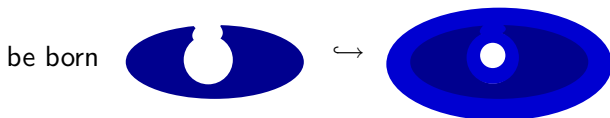
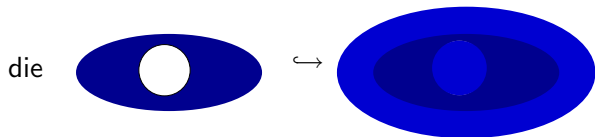
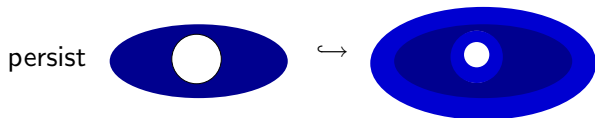
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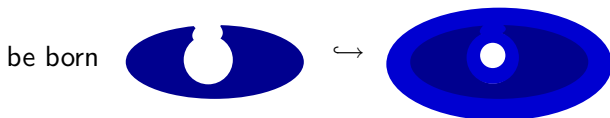
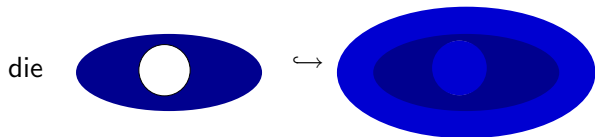
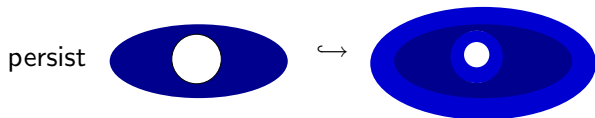
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These numbers are consistent with the sample coming from some region with the homotopy type of a circle.

During an inclusion  $S_i \hookrightarrow S_j$  holes can

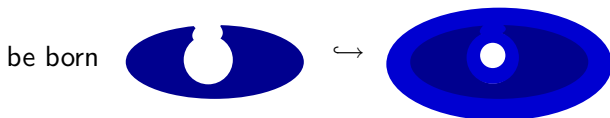
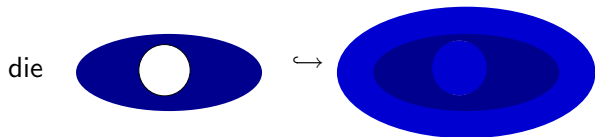
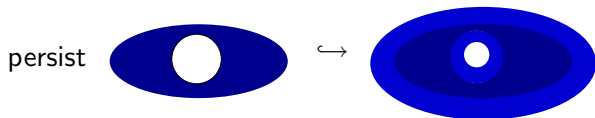


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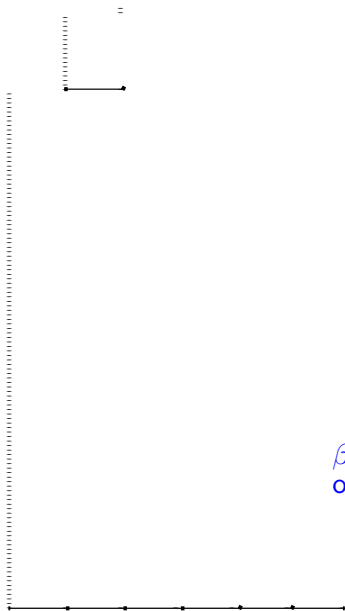
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$$= \text{rank} (H_n(S_i, \mathbb{Q}) \longrightarrow H_n(S_j, \mathbb{Q}))$$

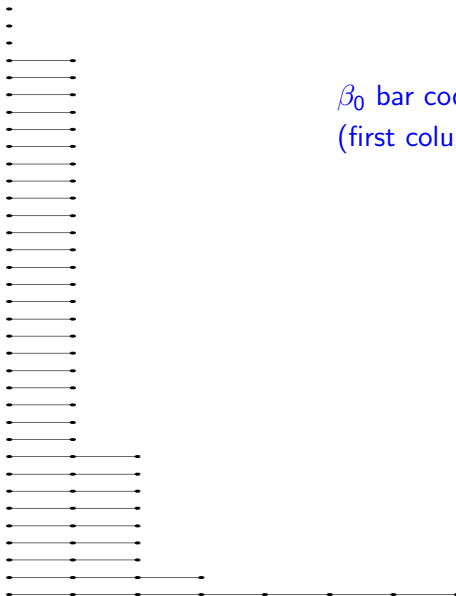
## Bar codes

Matrix  $(\beta_n^{ij})$  represented by graph with:

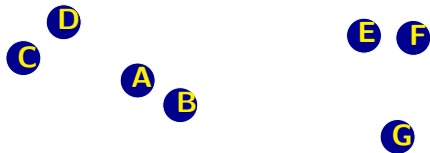
- ▶ vertices arranged in columns
- ▶ only horizontal edges
- ▶  $i$ th column has  $\beta_n^{ii} = \beta_n(S_i)$  vertices
- ▶  $\beta_n^{ij}$  paths from  $i$ th column to  $j$ th column



$\beta_1$  bar code for  
our example



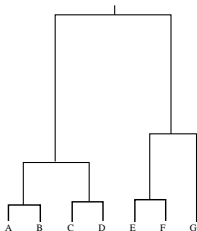
$\beta_0$  bar code for our example  
(first column cropped)



$\beta_0$  bar codes



contain less information than dendrograms (or phylogenetic trees)





## How to thicken data?

### Low-dimensional data in $\mathbb{R}^n$ :

(digital images, dynamical systems, ...)

Construct a filtered cubical subcomplex of  $\mathbb{R}^n$ .

### High-dimensional data:

(statistical data sample of  $N$  points, ...)

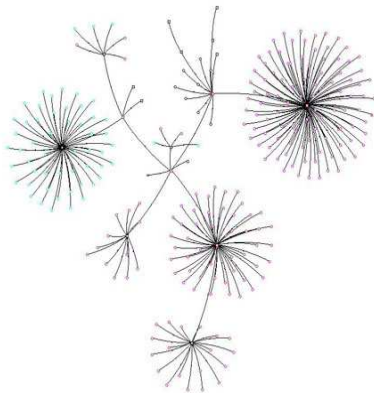
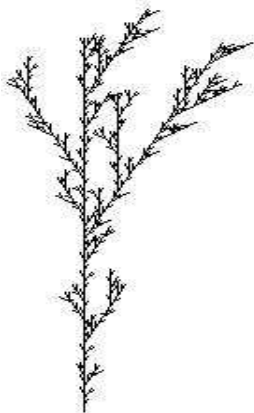
Construct a filtration on the simplex  $\Delta^N$ .

### Group-theoretic data:

Construct a filtration on a (regular CW) Eilenberg-MacLane space.

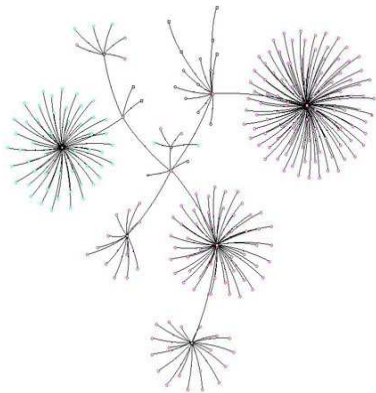
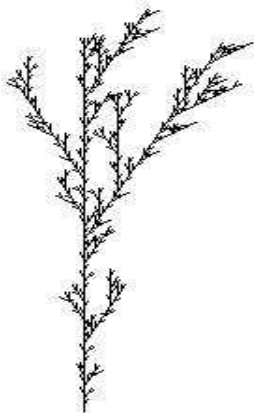
## Motivating Example II: polymer growth

How do the shapes of the following planar graphs differ?

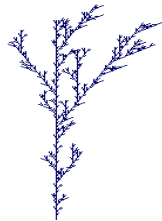


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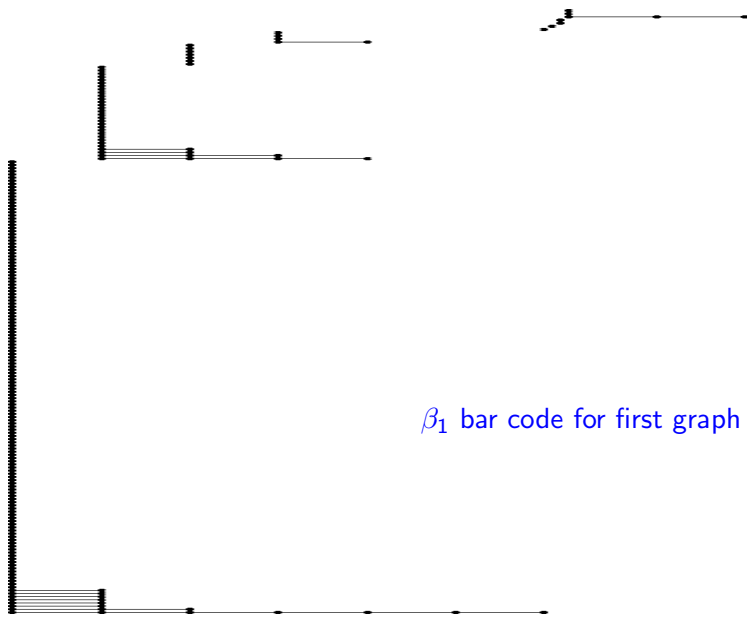


MacPherson & Srolovitz: Persistent homology can capture shape.

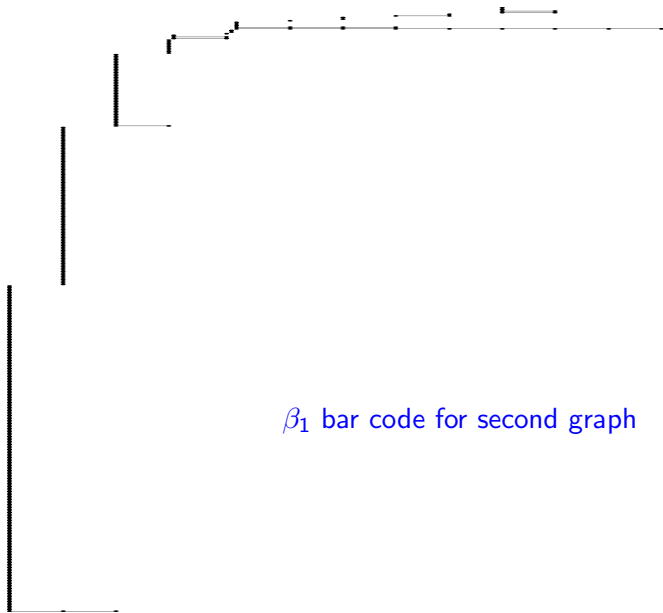


Various thickenings of the first graph





$\beta_1$  bar code for first graph



$\beta_1$  bar code for second graph

MacPherson & Srolovitz define the “homological dimension” of a graph in terms of:

- ▶ The number of bars in its bar code
- ▶ the length of these bars
- ▶ the centres of these bars

## Motivating Example III: medical images

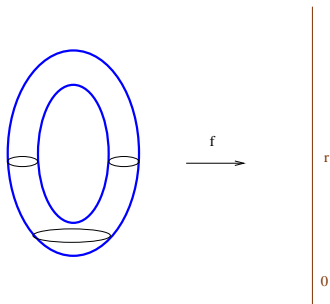
Digital images  $f: \mathbb{M} \rightarrow \mathbb{R}$  could be analyzed using bar codes.



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Consider a torus  $\mathbb{M}$ , height function  $f$



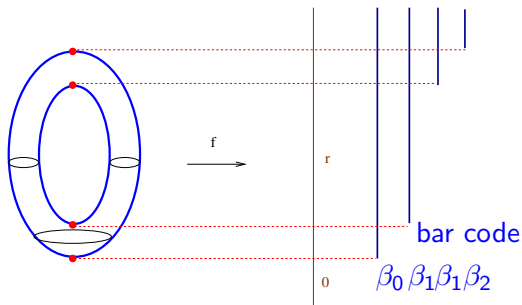
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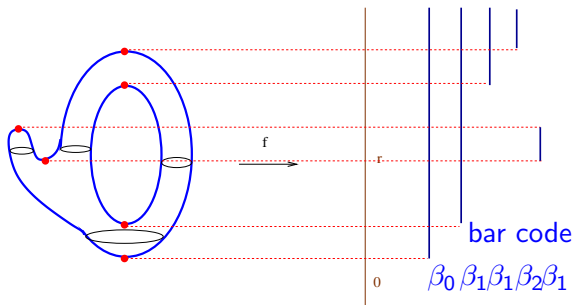
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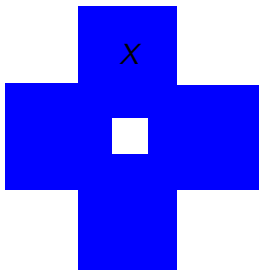
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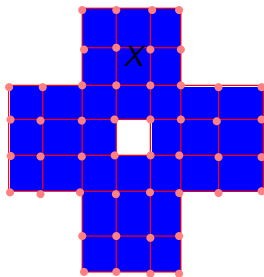
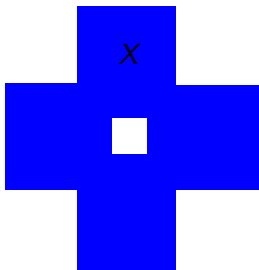
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To compute the homology of a space

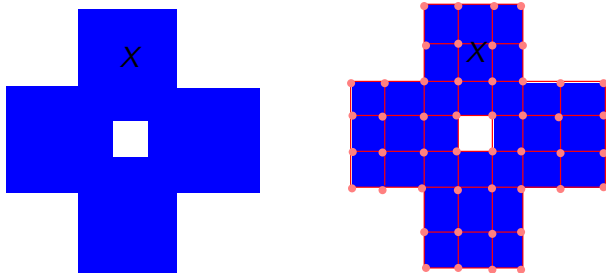


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we impose some cell structure, and consider

$$\dots \rightarrow C_2(X) \xrightarrow{\partial_2} C_1(X) \xrightarrow{\partial_1} C_0(X) \rightarrow 0$$

- ▶  $C_n(X)$  = vector space, basis  $\leftrightarrow$   $n$ -cells
- ▶  $\partial_n$  induced by cell boundaries
- ▶  $H_n(X) = \ker(\partial_n)/\text{image}(\partial_{n+1})$

Our cubical representation of the thickened planar graph  $X =$



has 45467 2-cells, 91531 edges and 46060 vertices. A naive computation of

$$H_1(X, \mathbb{F}) = \mathbb{F}^5$$

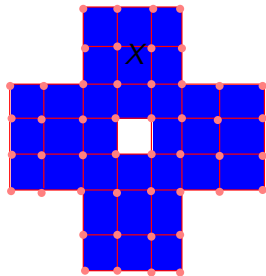
is slow.

Simple homotopy collapses can yield homotopy retracts  $Y \subset X$ .

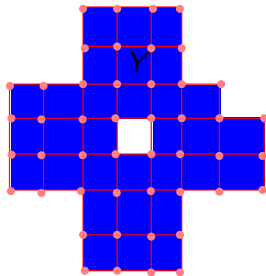


Simple homotopy collapses can yield homotopy retracts  $Y \subset X$ .

If  $X = Y \cup \overline{e^n}$  and  $Y \cap \overline{e^n} \simeq *$  then  $X \simeq Y$ .



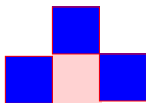
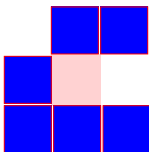
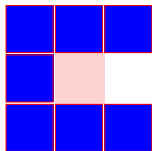
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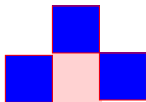
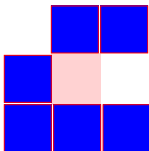
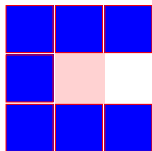
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etc.

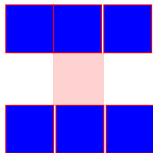
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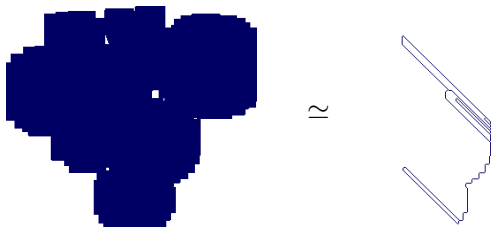
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Many neighbourhoods not in list:



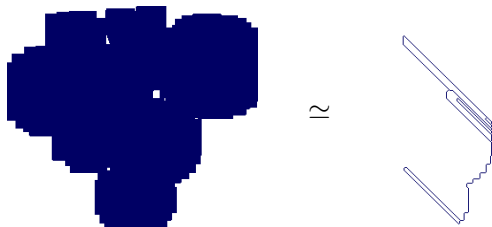
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has only 1717 vertices, 2342 edges and 621 faces.

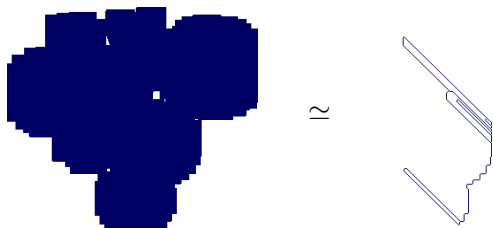
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The computation

$$H_1(X, \mathbb{Z}) \cong H_1(C_*(Y)/C_*(Z)) = \mathbb{Z}^5$$

takes a fraction of a second.

## Contracting homotopies

From a homotopy retract  $Y \subset X$  we often need

- ▶ the chain inclusion  $\iota_*: C_*(Y) \hookrightarrow C_*(X)$
- ▶ its quasi-inverse  $\phi_*: C_*(X) \rightarrow C_*(Y)$
- ▶ and a family of homomorphisms

$$h_n: C_n(X) \rightarrow C_{n+1}(X) \quad (n \geq 0)$$

satisfying

$$\iota_n \phi_n - 1 = \partial_{n+1} h_n + h_{n-1} \partial_n \quad (h_{-1} = 0).$$



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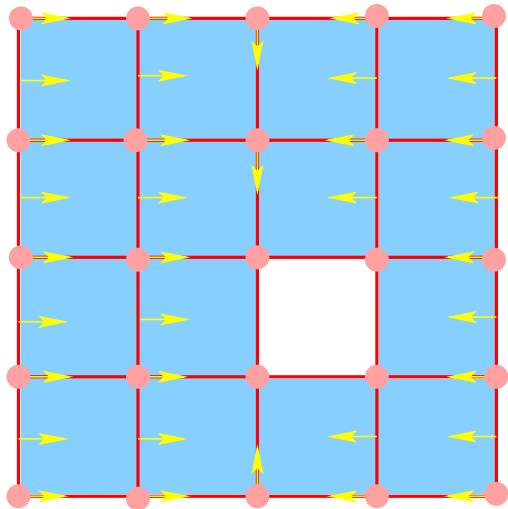
Discrete Morse Theory is handy for computing  $h_n, \phi_n$ .

A **discrete vector field** on a regular CW-space  $X$  is a collection of arrows  $s \rightarrow t$  where

- ▶  $s, t$  are cells and any cell is involved in at most one arrow
- ▶  $\dim(t) = \dim(s) + 1$
- ▶  $s$  lies in the boundary of  $t$

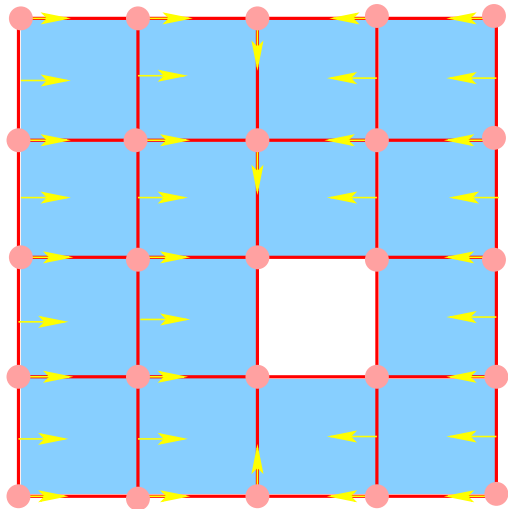
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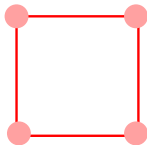


A **discrete vector field** on a cellular space  $X$  is a collection of arrows  $s \rightarrow t$  where

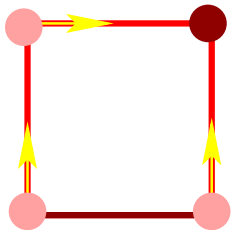
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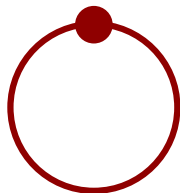
$\mathbb{R}^2$



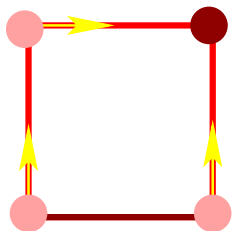
## Continued example



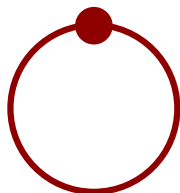
21



## Continued example



$\simeq$



### Theorem:

If  $X$  is a regular CW-space with discrete vector field then there is a homotopy equivalence

$$X \simeq Y$$

where  $Y$  is a CW-space whose cells correspond to those of  $X$  not involved in any arrow.

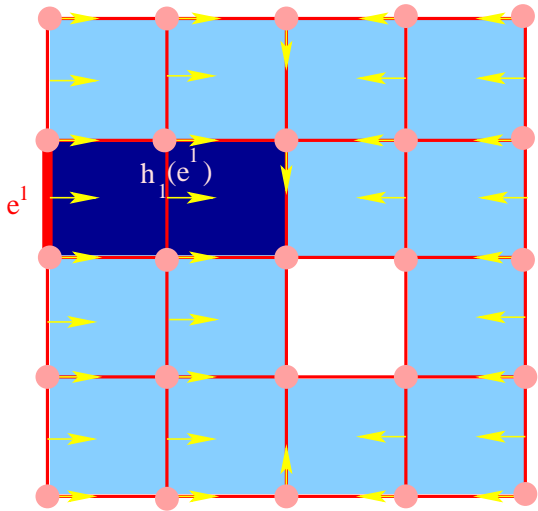
## Contracting homotopy

Given a discrete vector field we define the contracting homotopy

$$h_n: C_n(X) \rightarrow C_{n+1}(X)$$

on generators  $e^n$  by

$$h_n(e^n) = \begin{cases} 0 & \text{if } e^n \text{ is not a source} \\ \sum e_i^{n+1} & \partial_{n+1}(\sum e_i^{n+1}) \text{ contains just the one} \\ & \text{source } e^n \text{ of dimension } n \end{cases}$$





## Group (co)homology

**Definition:** The (co)homology of a group  $G$  is the (co)homology of  $X/G$  where  $X$  is any contractible space admitting a free  $G$ -action.

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Let's illustrate for  $G = S_3$ .

$$x = (1, 2), y = (1, 2, 3)$$

$$G = \langle x, y \rangle$$

$X^0 =$  one free orbit of vertices

$$y^2 \cdot e^0$$



$$xy \cdot e^0$$



$$x \cdot e^0$$



$$xy^2 \cdot e^0$$

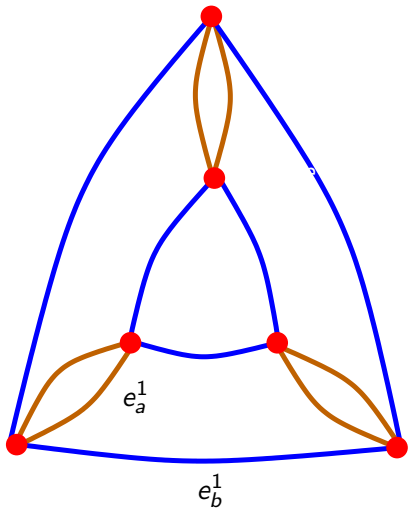


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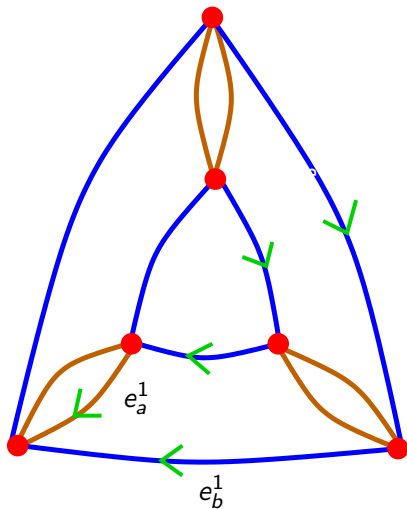


$$y \cdot e^0$$

$X^1 = X^0 \cup$  enough free orbits of edges to ensure  $\pi_0(X^1) = 0$



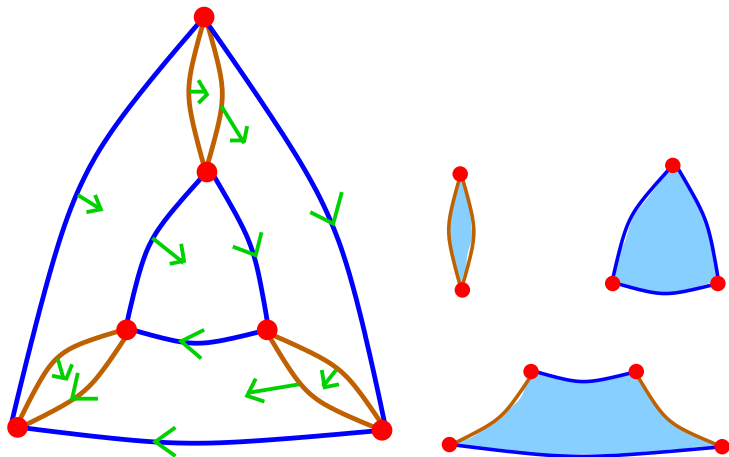
Discrete vector field on  $X^1$  ensures  $\pi_0(X^1) = 0$ .



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Discrete vector field on  $X^2$



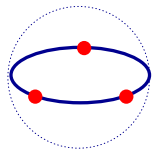
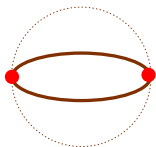
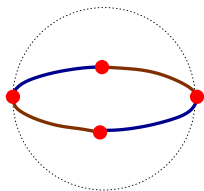
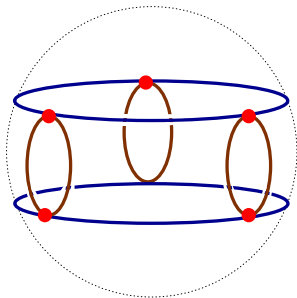
ensures that three orbits suffice.



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Discrete vector field on  $X^3$  ensures that four orbits suffice.



Algorithm produces a small regular CW-space  $X$  with free  $G$ -action and homotopy retraction  $X \simeq *$ .

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```
gap> R:=ResolutionFiniteGroup(SymmetricGroup(4),16);;
```

```
gap> C:=TensorWithIntegers(R);;
```

```
gap> Homology(C,15);
```

```
[ 2, 2, 2, 2, 2, 12 ]
```

## An element of choice in homological algebra

Let  $X'$  be contractible. Often need to choose a homomorphism  $f_{n+1}$  so that the following diagram commutes.

$$\begin{array}{ccc} C_{n+1}(X) & \xrightarrow{f_{n+1}} & C_{n+1}(X') \\ \downarrow \partial_{n+1} & & \downarrow \\ C_n(X) & \xrightarrow{f_n} & C_n(X') \end{array}$$

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Choice is algorithmic if some contracting homotopy  $h_n: C_n(X') \rightarrow C_{n+1}(X')$  has already been specified for  $X'$ .

$$f_{n+1}(x) = h_n( f_n( \partial_{n+1}(x) ) )$$

## Homology of bigger groups?



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Theorem (Dutour, E, Shürmann)

$$H_n(PSL_4(\mathbb{Z}), \mathbb{Z}) = \begin{cases} 0 & n = 1 \\ (\mathbb{Z}_2)^3 & n = 2 \\ \mathbb{Z} \oplus (\mathbb{Z}_4)^2 \oplus (\mathbb{Z}_3)^2 \oplus \mathbb{Z}_5, & n = 3 \\ (\mathbb{Z}_2)^4 \oplus \mathbb{Z}_5, & n = 4 \\ (\mathbb{Z}_2)^{13}, & n = 5. \end{cases}$$

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### Homological Perturbation Lemma inputs:

- 1)  $PSL_4(\mathbb{Z})$ -equivariant CW-structure on  $\mathbb{H}^4$ .
- 2) CW-spaces  $X$  with free  $G$ -action and explicit contracting homotopy for each conjugacy class of cell stabilizer group  $G$ .

### Homological Perturbation Lemma outputs:

Contractible CW-space with free  $PSL_4(\mathbb{Z})$ -action.

## Potential application of bar codes : the shape of $p$ -groups?

Group surjections

$$G \twoheadrightarrow G'$$

correspond to classifying space inclusions

$$B(G) = X/G \hookrightarrow B(G) = X'/G' .$$

The lower central series

$$\gamma_1 G = G, \quad \gamma_2 G = [G, G], \quad \dots, \quad \gamma_{i+1} G = [G, \gamma_i G]$$

corresponds to a series of inclusions

$$\dots \hookrightarrow B\left(\frac{G}{\gamma_4 G}\right) \hookrightarrow B\left(\frac{G}{\gamma_3 G}\right) \hookrightarrow B\left(\frac{G}{\gamma_2 G}\right) \hookrightarrow B\left(\frac{G}{\gamma_1 G}\right) \simeq *$$

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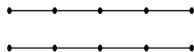
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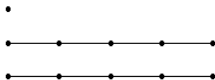
**Definition:**

We denote the persistent homology module of these inclusions by

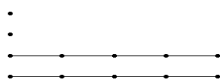
$$H_n^{**}(G) = \{H_n^{ij}(G, \mathbb{F}_p)\}_{i < j}.$$



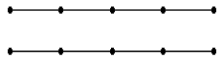
$$H_1^{**}(D_{32})$$



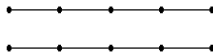
$$H_2^{**}(D_{32})$$



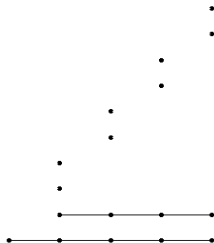
$$H_3^{**}(D_{32})$$



$$H_1^{**}(Q_{32})$$



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Proposition : (E & King)

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Proposition: For a  $p$ -group  $G$  all  $\beta_2$  bars start in the first column.

A group  $G$  of order  $p^n$  with  $\gamma_{c+1}G = 1$ ,  $\gamma_c G \neq 1$  is said to have  
coclass

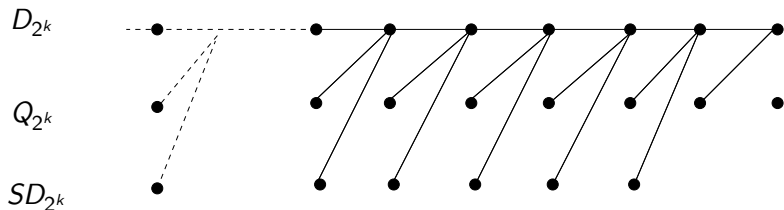
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$$r = n - c .$$

The **coclass graph**  $\mathbb{G}(p, r)$  has as vertices the  $p$ -groups of coclass  $r$ . Two vertices  $G, Q$  are connected by an edge if

$$Q \cong G/L_c(G) \quad \text{with } |L_c(G)| = p .$$



$\mathbb{G}(2, 1)$

## Theorem (J. Carlson):

The groups  $G \in \mathbb{G}(2, r)$  give rise to just finitely many non-isomorphic cohomology rings  $H^*(G, \mathbb{F}_2)$ .

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### Observation (E & King):

Almost all non-leaves  $G$  in a coclass tree have the same  $H_2(G, \mathbb{F}_p)$ .

## A coclass 2 tree and its mainline $\beta_3$ bar code

