

# Towards a certified computation of homology groups for digital images\*

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4th International Workshop on Computational Topology in Image  
Context (CTIC 2012)

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Commission FP7, STREP project ForMath, n. 243847

# Motivation



R. Mikhailov and J. Wu. On homotopy groups of the suspended classifying spaces. *Algebraic and Geometric Topology* 10(2010), 565 – 625.

- Computable aim (without computers!)
- Theorem 5.4: Let  $A_4$  be the 4-th alternating group. Then  $\pi_4(\Sigma K(A_4, 1)) = \mathbb{Z}_4$

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- Kenzo computing homotopy groups
- $\pi_4(\Sigma K(A_4, 1)) = \mathbb{Z}_{12}$

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## In that situation

Analyze correctness of programs to ensure correctness of mathematical results

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*Certified computations of homology groups from biomedical digital images*

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*Certified computations of homology groups from **biomedical digital images***

- Need of **trustworthy** tools

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*Certified computations* of homology groups from biomedical digital images

- Need of trustworthy tools
- Formally verified using an **interactive** proof assistant



# Interactive Proof Assistants

- What is an Interactive Proof Assistant?
  - Software tool for the development of formal proofs
  - Man-Machine collaboration:
    - Human: design the proofs
    - Machine: fill the gaps
  - Examples: Isabelle, Hol, ACL2, Coq, ...

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  - Examples: Isabelle, Hol, ACL2, Coq, ...
- Applications:
  - Mathematical proofs:
    - Four Color Theorem
    - Fundamental Theorem of Algebra
    - Kepler conjecture
  - Software and Hardware verification:
    - C compiler
    - AMD5K86 microprocessor
    - ...

# COQ/SSREFLECT

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  - Based on Calculus of Inductive Constructions
  - Interesting feature: program extraction from a constructive proof

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- Demo

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## General Goal

*An Algebraic Topology library formalized in COQ/SSREFLECT*



# Table of Contents

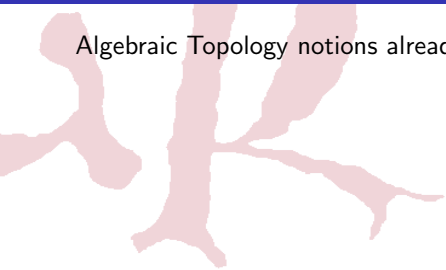
- 1 Digital Algebraic Topology in COQ/SSREFLECT
- 2 Computing homology with COQ/SSREFLECT
- 3 Computing Discrete Vector Fields
- 4 Conclusions and Further work

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# Verification in COQ/SSREFLECT

Algebraic Topology notions already formalized in COQ/SSREFLECT:



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Algebraic Topology notions already formalized in COQ/SSREFLECT:

Simplicial Complexes:

(\* V is the vertex set \*)

Variable V : finType.

(\* A simplex over V is a finite subset of V \*)

Definition simplex := {set V}.

(\* Simplicial Complex \*)

Definition simplicial\_complex (c : {set simplex}) :=

forall x, x \in c -> forall y : simplex, y \subset x -> y \in c.

(\* Generation of simplicial complex from a list of simplices \*)

Definition create\_sc (s : seq simplex) : {set simplex} :=

\bigcup\_{sp <- s} powerset sp.

Lemma create\_sc\_correct : forall s, simplicial\_complex (create\_sc s).

# Verification in COQ/SSREFLECT

Algebraic Topology notions already formalized in COQ/SSREFLECT:

Boundary Matrices of Simplicial Complexes:

```
Lemma incidence_matrices_sc_product:
  forall (V:finType) (n:nat) (sc: {set (simplex V)}),
    simplicial_complex sc ->
      (incidence_mx_n sc n) *m (incidence_mx_n sc (n.+1)) = 0.
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Homology:

```

Variable (K : fieldType) (V1 V2 V3 : vectType K)
  (f : linearApp V1 V2) (g : linearApp V2 V3).
  
```

```

Definition Homology := ((lker g) :\: (limg f)).
  
```

```

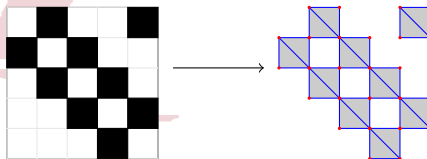
Definition dim_homology (mxf:'M[K]_(v1,v2)) (mxg:'M[K]_(v2,v3)) :=
  v2 - \rank mxg - \rank mxf.
  
```

```

Lemma dimHomologyrankE: mxf *m mxg = 0 ->
  \dim Homology (LinearApp mxf) (LinearApp mxg) = dim_homology mxf mxg.
  
```

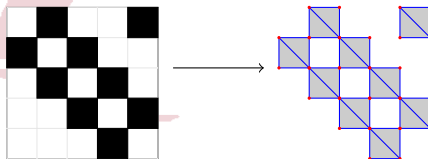
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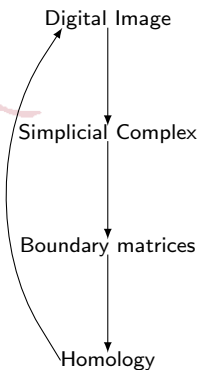


- An image is represented by means of a list of lists of booleans
- Function `createfacets` generates a list of simplexes from an image
- Correctness of `createfacets` has been proved



# Verification in COQ/SSREFLECT

Putting all the pieces together:



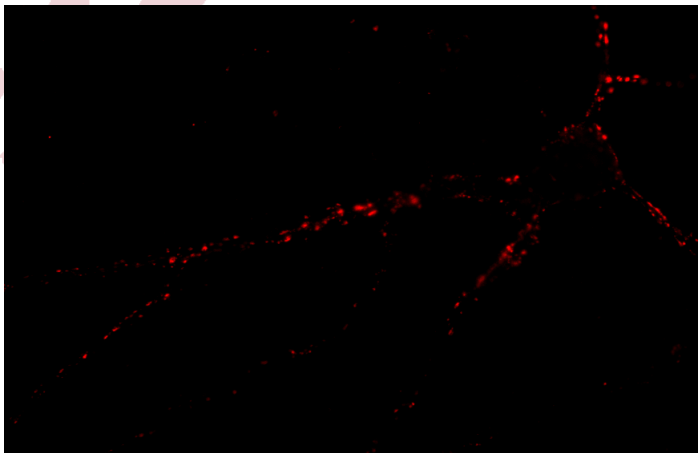
Achievement

Certified computation of Homology from digital images

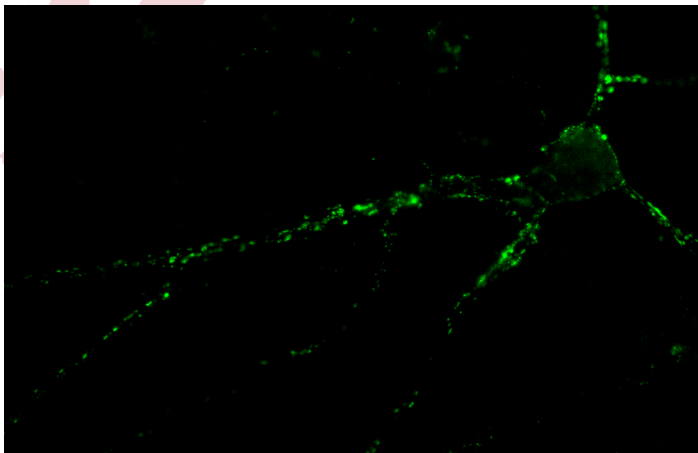
# Testing our framework: Counting synapses

- Synapses are the points of connection between neurons
- Relevance: Computational capabilities of the brain
- Procedures to modify the synaptic density may be an important asset in the treatment of neurological diseases
- An automated and reliable method is necessary

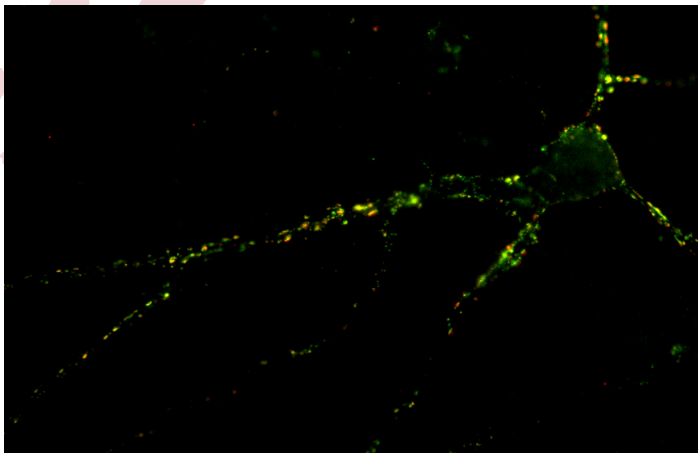
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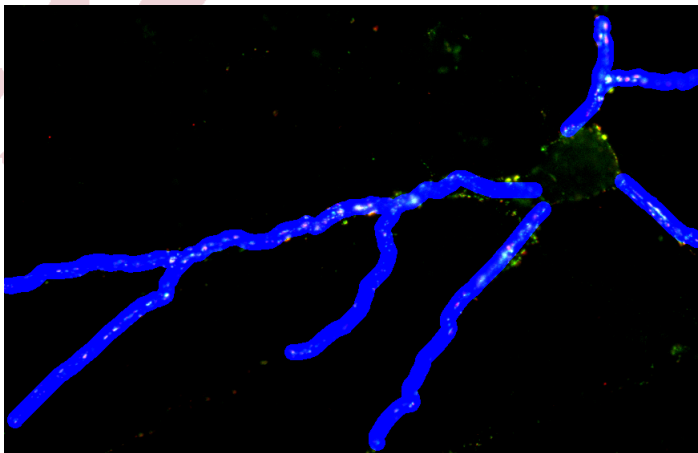
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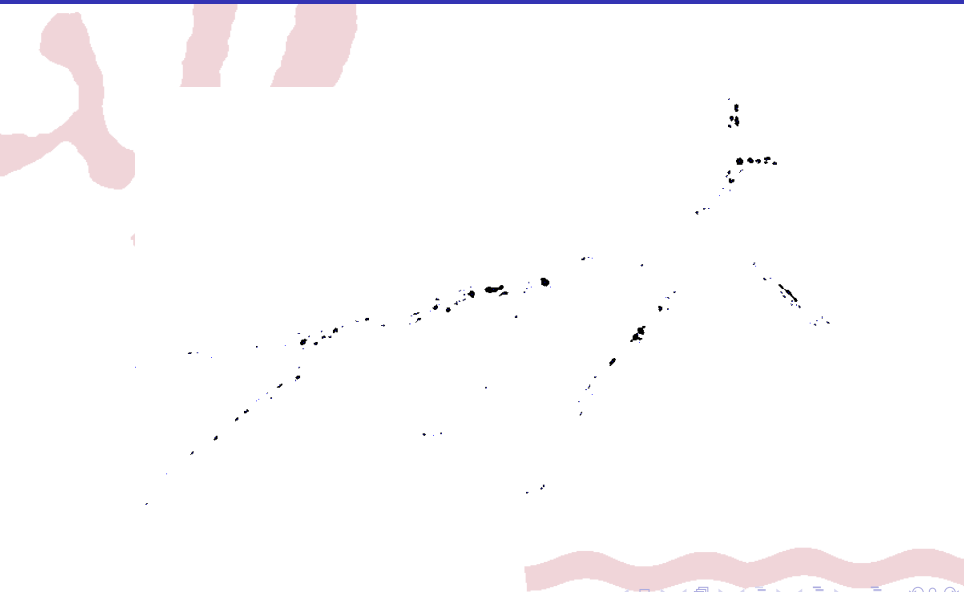
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  - Measure the number of connected components of the image
  - Good benchmark to test our framework: computation of  $H_0$



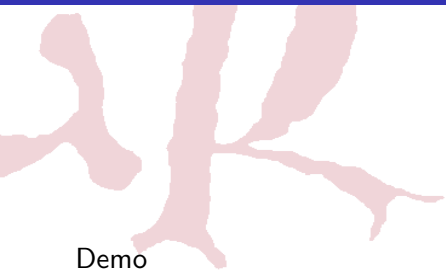
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- Counting synapses:
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  - Good benchmark to test our framework: computation of  $H_0$
  - SynapCountJ: software to measure synaptic density evolution

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# Demo



# Computing inside CoQ

- CoQ is a Proof Assistant and **not** a Computer Algebra system

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- Efficient implementations of mathematical algorithms inside CoQ is an ongoing effort
- Achieving a better efficiency:
  - Extraction mechanism
  - Internal compilation of CoQ terms to OCAML
  - Sparse matrices
  - Better representations for images
  - Reduction of matrices keeping the same homological information

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# Discrete Vector Fields + Effective Homology

Reduction process:

- (Algebraic setting of) Discrete Morse Theory



A. Romero and F. Sergeraert. Discrete Vector Fields and Fundamental Algebraic Topology. 2010. <http://arxiv.org/abs/1005.5685v1>

- Effective Homology

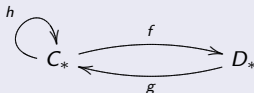


J. Rubio and F. Sergeraert. Constructive Algebraic Topology. Bulletin des Sciences Mathématiques, 2002, vol. 126, pp. 389-412

# Effective Homology

## Definition

A reduction  $\rho$  between two chain complexes  $C_*$  y  $D_*$  (denoted by  $\rho : C_* \Rightarrow D_*$ ) is a triple  $\rho = (f, g, h)$



satisfying the following relations:

- 1)  $fg = \text{Id}_{D_*}$ ;
- 2)  $d_C h + h d_C = \text{Id}_{C_*} - gf$ ;
- 3)  $fh = 0$ ;  $hg = 0$ ;  $hh = 0$ .

## Theorem

If  $C_* \Rightarrow D_*$ , then  $C_* \cong D_* \oplus A_*$ , with  $A_*$  acyclic, which implies that  $H_n(C_*) \cong H_n(D_*)$  for all  $n$ .

# Discrete Vector Fields

## Definition

Let  $C_* = (C_p, d_p)_{p \in \mathbb{Z}}$  a free chain complex with distinguished  $\mathbb{Z}$ -basis  $\beta_p \subset C_p$ . A discrete vector field  $V$  on  $C_*$  is a collection of pairs  $V = \{(\sigma_i; \tau_i)\}_{i \in I}$  satisfying the conditions:

- Every  $\sigma_i$  is some element of  $\beta_p$ , in which case  $\tau_i \in \beta_{p+1}$ . The degree  $p$  depends on  $i$  and in general is not constant.
- Every component  $\sigma_i$  is a regular face of the corresponding  $\tau_i$ .
- Each generator (cell) of  $C_*$  appears at most one time in  $V$ .

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## Definition

A  $V$ -path of degree  $p$  and length  $m$  is a sequence  $\pi = ((\sigma_{i_k}, \tau_{i_k}))_{0 \leq k < m}$  satisfying:

- Every pair  $(\sigma_{i_k}, \tau_{i_k})$  is a component of  $V$  and  $\tau_{i_k}$  is a  $p$ -cell.
- For every  $0 < k < m$ , the component  $\sigma_{i_k}$  is a face of  $\tau_{i_{k-1}}$ , non necessarily regular, but different from  $\sigma_{i_{k-1}}$ .

# Discrete Vector Fields

## Definition

*A discrete vector field  $V$  is admissible if for every  $p \in \mathbb{Z}$ , a function  $\lambda_p : \beta_p \rightarrow \mathbb{N}$  is provided satisfying the following property: every  $V$ -path starting from  $\sigma \in \beta_p$  has a length bounded by  $\lambda_p(\sigma)$ .*

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## Theorem

Let  $C_* = (C_p, d_p)_{p \in \mathbb{Z}}$  be a free chain complex and  $V = \{(\sigma_i; \tau_i)\}_{i \in I}$  be an admissible discrete vector field on  $C_*$ . Then the vector field  $V$  defines a canonical reduction  $\rho = (f, g, h) : (C_p, d_p) \Rightarrow (C_p^c, d_p^c)$  where  $C_p^c = \mathbb{Z}[\beta_p^c]$  is the free  $\mathbb{Z}$ -module generated by the critical  $p$ -cells.

# Vector fields and integer matrices

$M$  is one of the boundary matrices of the chain complex:

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An admissible vector field  $V$  for  $M$  is nothing but a set of integer pairs  $\{(a_i, b_i)\}$  satisfying these conditions:

- 1  $1 \leq a_i \leq m$  and  $1 \leq b_i \leq n$
- 2 The entry  $M[a_i, b_i]$  of the matrix is  $\pm 1$
- 3 The indices  $a_i$  (resp.  $b_i$ ) are pairwise different
- 4 Non existence of loops

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```
Definition admissible_dvf (M: 'M['F_2]_(m,n)) (V: seq ('I_m * 'I_n)) (
  ords : simpl_rel 'I_m) :=
  all [pred p | M p.1 p.2 == 1] V &&
  uniq (map (@fst _ _) V) && uniq (map (@snd _ _) V) &&
  all [pred i | ~~ (connect ords i i)] (map (@fst _ _) V).
```

# Romero-Sergeraert algorithms

## Algorithm (Romero-Sergeraert 2010)

*Input: A matrix  $M$*

*Output: An admissible discrete vector field for  $M$*

- Implemented with the function `gen_adm_dvf`
- Verified in COQ/SSREFLECT

**Lemma** `admissible_gen_adm_dvf m n (M : 'M['F_2]_(m,n)) :`  
`let (V,ords) := gen_adm_dvf M in admissible M V ord.`

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## Algorithm (Romero-Sergeraert 2010)

*Input: A matrix  $M$  and an admissible discrete vector field of  $M$*

*Output: A reduced matrix  $M'$*

- Already implemented
- Verification in COQ/SSREFLECT is an ongoing work

# Results

Some remarkable results have been obtained:

- 500 randomly generated images:
  - Initial size of matrices:  $\sim 100 \times 300 \rightarrow \sim 12$  seconds
  - After reduction process:  $\sim 5 \times 50 \rightarrow$  milliseconds
  - Most of reduced matrices were null

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- Biomedical images:
  - Initial size of matrices:  $\sim 700 \times 1400 \rightarrow \infty$
  - After reduction process just 25 seconds



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# Conclusions

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- Application to a biomedical problem: counting synapses

# Further work

- Formalization aspects:
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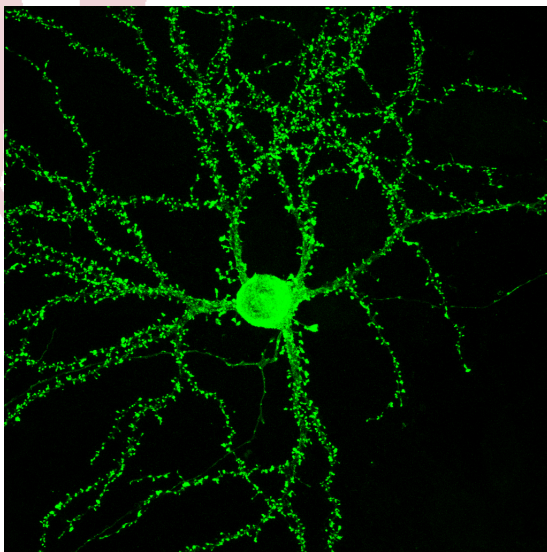
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# Further work

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  - Correctness of reduction process
  - Integer homology computation
- Efficiency issues:
  - Better representations and more efficient algorithms
- Homology certified programs applied to more interesting biomedical cases:
  - Homology group in dimension 1 (structure detection)
  - Persistent Homology (denoising)



# Further work



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