# Infrastructure for generic code in SageMath: categories, axioms, constructions

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Numbers 42,  $\frac{7}{9}$ ,  $\frac{l+sqrt(3)}{2}$ ,  $\pi$ , 2.71828182845904523536028747?

Matrices: 
$$\left(\begin{array}{cccc} 4 & -1 & 1 & -1 \\ -1 & 2 & -1 & -1 \\ 0 & 5 & 1 & 3 \end{array}\right)$$

Polynomials: 
$$-9x^8 + x^7 + x^6 - 13x^5 - x^3 - 3x^2 - 8x + 4$$

Series: 
$$1 + 1x + \frac{1}{2}x^2 + \frac{1}{6}x^3 + \frac{1}{24}x^4 + \frac{1}{120}x^5 + \cdots$$

Finite fields, algebraic extensions, elliptic curves, ...

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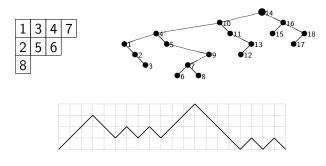
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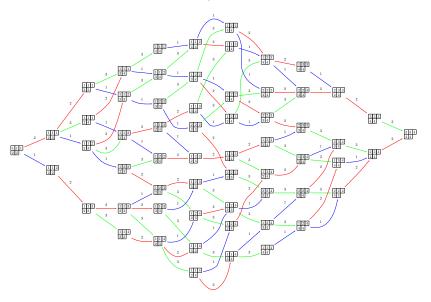
## Combinatorial objects



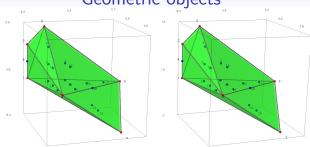
#### $01001010010010100101001001001001001010010 \cdots$

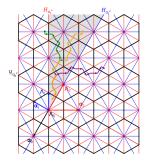
$$\frac{\frac{1}{6}q^2 - \frac{1}{6}q}{q^5 + 2q^4 + 3q^3 + 3q^2 + 2q + 1} \underbrace{ \underbrace{\frac{1}{2}q}_{q^5 + 2q^4 + 3q^3 + 3q^2 + 2q + 1}}_{\textcircled{a}} \underbrace{ \underbrace{\frac{1}{2}q}_{q^4 + q^3 + 2q^2 + q + 1}}_{\textcircled{a}} \underbrace{ \underbrace{\frac{1}{2}q}_{q^4 + q^3 + 2q^2 + q + 1}}_{\textcircled{a}} \underbrace{ \underbrace{\frac{1}{2}q}_{q^4 + q^3 + 2q^2 + q + 1}}_{\textcircled{a}} \underbrace{ \underbrace{\frac{1}{2}q}_{q^4 + q^3 + 2q^2 + q + 1}}_{\textcircled{a}} \underbrace{ \underbrace{\frac{1}{2}q}_{q^4 + q^3 + 2q^2 + q + 1}}_{\textcircled{a}} \underbrace{ \underbrace{\frac{1}{2}q}_{q^4 + q^3 + 2q^2 + q + 1}}_{\textcircled{a}} \underbrace{ \underbrace{\frac{1}{2}q}_{q^4 + q^3 + 2q^2 + q + 1}}_{\textcircled{a}} \underbrace{ \underbrace{\frac{1}{2}q}_{q^4 + q^3 + 2q^2 + q + 1}}_{\textcircled{a}} \underbrace{ \underbrace{\frac{1}{2}q}_{q^4 + q^3 + 2q^2 + q + 1}}_{\textcircled{a}} \underbrace{ \underbrace{\frac{1}{2}q}_{q^4 + q^3 + 2q^4 + 1}}_{\textcircled{a}} \underbrace{ \underbrace{\frac{1}{2}q}_{q^4 + q^3 + 2q^4 + 1}}_{\textcircled{a}} \underbrace{ \underbrace{\frac{1}{2}q}_{q^4 + q^4 + 1}}_{\textcircled{a}} \underbrace{ \underbrace{\frac{1}{2}q}_{q^4 + q^4 + 1}}_{\textcircled{a}} \underbrace{ \underbrace{\frac{1}{2}q}_{q^4 + 1}}_{\textcircled{a}} \underbrace{ \underbrace{\frac{1}{2}q}_{q^$$

# Graphs



# Geometric objects





# Sage : a large library of mathematical objects and algorithms

- 1.5M lines of code/doc/tests (Python/Cython) plus dependencies
- 1k+ types of objets
- 2k+ methods and functions
- 200 regular contributors

#### **Problems**

- How to structure this library
- How to guide the user
- How to promote consistency and robustness?
- How to reduce duplication?

# Example: binary powering

```
sage : m^8 == m*m*m*m*m*m*m == ((m^2)^2)^2
True

sage : m = random_matrix(QQ, 4)
sage : m^8 == m*m*m*m*m*m*m == ((m^2)^2)^2
True
```

• Complexity :  $O(\log(k))$  instead of O(k)!

sage: m = 3

We would want a single generic implementation!

# Example: binary powering II

## Algebraic context

- Semigroup: a set S endowed with an associative binary internal law \*
- The integers form a semigroup
- Square matrices form a semigroup

#### We want

- Implement pow\_exp(x,k)
- Specify that
  - if x is an *element* of a semigroup
  - then x<sup>k</sup> can be computed with pow\_exp(x,k)

## What happens if

- x is an element of a group?
- x is an element of a ring in small caracteristic?

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#### Selection mechanism

#### We want

- Design a hierarchy of contexts and specify the operations there
- Provide generic implementations of those operations
- Specify in which context they are valid
- · Specify in which context each object is

We need a *selection mechanism*:
to resolve the call f(x) by selecting the most specific
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# Hierarchy of contexts for mathematics

## In general

Hard problem : isolate the proper business concepts

#### In mathematics

- A small number of fundamental concepts : operations, axioms
- Concepts known by the users
- The richness comes from combining those few concepts to form many contexts

Field: +, \*, associative, commutative, distributive, ...

# Hierarchy of contexts for mathematics

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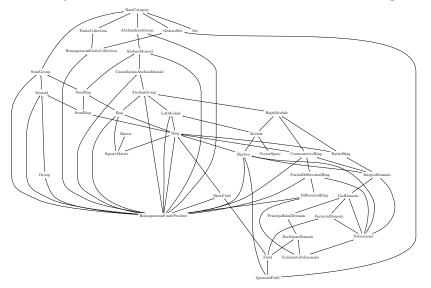
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## A hierarchy of contexts based on mathematical categories



A robust hierarchy based on a century of abstract algebra

## Pioneers 1980- I

## Axiom, Aldor, MuPAD

- •
- Selection mechanism: roughly object oriented programming
- Hierarchy of abstract classes modeling the mathematical categories

```
category Semigroups:
    category Magmas;

intpow := proc(x, k) ...
// other methods
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## Pioneers 1980- II

#### **GAP**

- Specific language
- One filter per basic concept : IsMagma(G), IsAssociative(G), ...
- InstallMethod(Operation, filters, method)
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# Implementation in Sage (2008-)

## Strategical choices

- A standard language (Python)
- Selection mechanism : object oriented programming

#### Constraints

- Partial compilation (Cython), serialization
- Multiple inheritance with Python / Cython
- Scaling!

- Distinction Élément/Parent (à la Magma)
- Morphismes
- Constructions fonctorielles
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# In practice

Let's write a parent and a category.

# Implementation in Sage

Parents, Elements, Morphisms

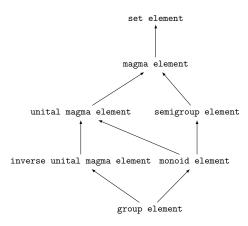
#### Category

A bookshelf about a given context :

- Semantic information
- Mixins for parents, elements, morphisms :
  - Documentation
  - Generic code
  - Tests

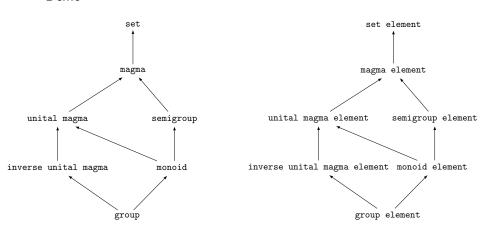
# Parent, éléments, morphismes, catégories

#### Demo



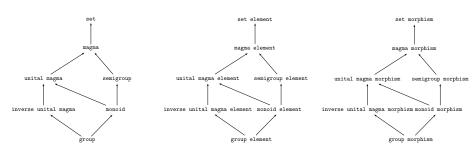
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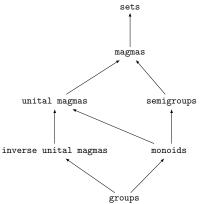


# Passage à l'échelle?

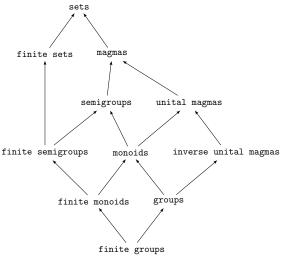
Démo

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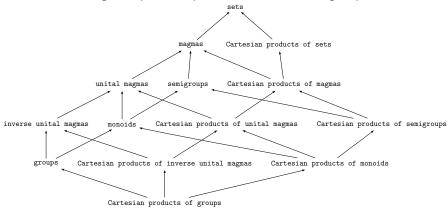
#### Catégories pour les groupes :



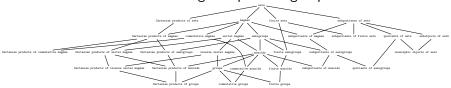
### Catégories pour les groupes finis :



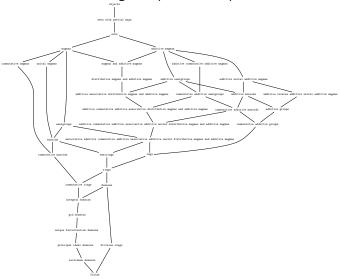
#### Catégories pour les produits cartésiens de groupes :



#### Toutes les catégories pour les groupes :



### Catégories pour les corps :



### Toutes les catégories :



# Passage à l'échelle?



#### Problème

Maîtriser l'explosion combinatoire du nombre de classes

### Résumé

- Sage modélise de très nombreux objets mathématiques
- Grande hiérarchie de catégories :
  - Sémantique
  - Mixins pour parents, éléments, morphismes
  - Documentation, Tests, Code générique
  - Constructions
- Hiérarchie robuste car elle modélise une hiérarchie existante (catégories en algèbre)
- Passage à l'échelle :
  - Construction dynamique à partir d'information sémantique et de mixins fournis par les catégories
  - Contrôle de la linéarisation

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## Le paradigme est bon; est-ce une bonne implantation?

#### Naturelle dans son contexte

- Langage dynamique (Python)
- Programmation orientée objet

#### En dehors de ce contexte?

- Performances? Compilation?
  - Le code générique peut appeler du code compilé
  - · Le code générique pourrait être compilé
  - Mais via appels de méthodes virtuelles
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## Pistes à explorer

### Implantations alternatives du paradigme?

- Dans un langage à typage statique ou graduel?
- À coup de templates et de traits?
   Par exemple en C++ / Scala
- Dans des assistants de preuve?
   Par exemple Coq
- Gérant le multi-paramètres Par exemple Julia, GAP

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