

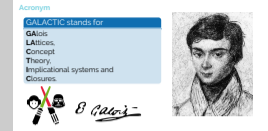
GALACTIC architecture

The **GALACTIC** Organization <contact@thegalactic.org>

2018-2023



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Acronym

GALACTIC stands for
GAlois
LAttices,
Concept
Theory,
Implicational systems and
Closures.



- the **GALACTIC** logo is a tribute to the french mathematician Évariste Galois who died following a gallant duel at the age of twenty;
- it is also a graphical summary of lattice drawings.

Purpose

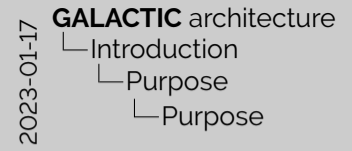
GALACTIC framework

Develop a framework on:

- ▶ **Lattice** theory^a
- ▶ **Formal Concept Analysis**^b.

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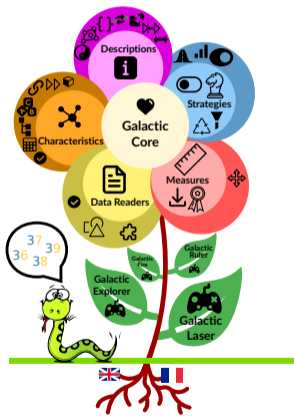
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Architecture



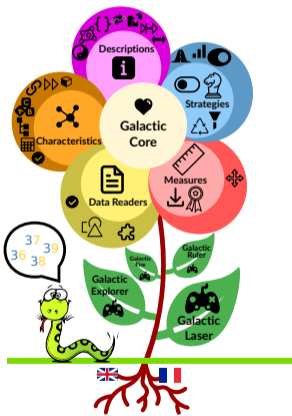
2023-01-17 **GALACTIC** architecture

- └ Architecture
- └ Architecture
- └ Architecture



- the core library is the center of the flower;
- the applications are in the leaves;
- characteristic plugins are in the orange petal;
- strategy plugins are in the blue petal;
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Architecture



Written in python, Fully extensible

The **GALACTIC** framework is architecturally designed with:

- ▶ a core library

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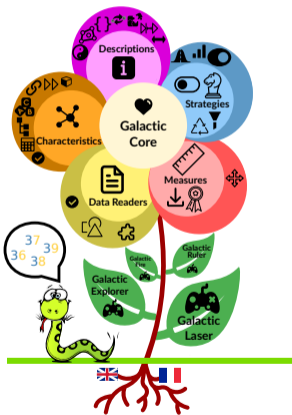
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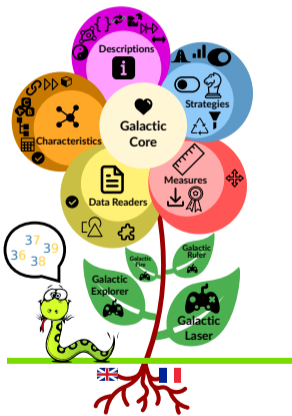


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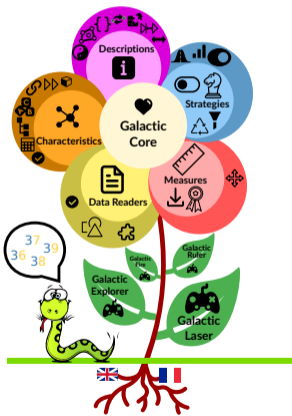
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- ▶ applications
- ▶ characteristic plugins
- ▶ description plugins

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GALACTIC architecture

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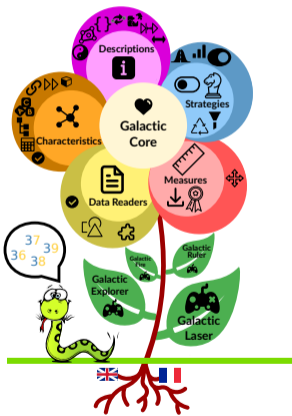
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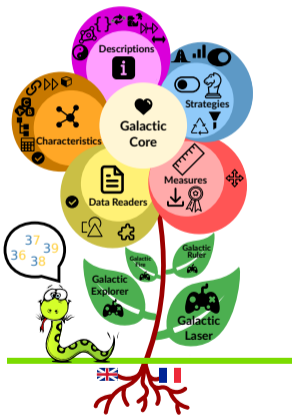
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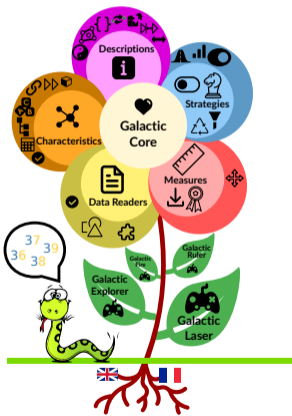
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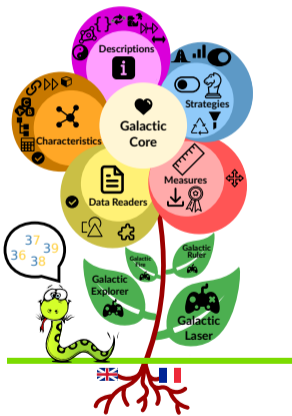
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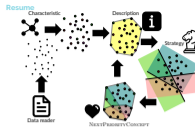


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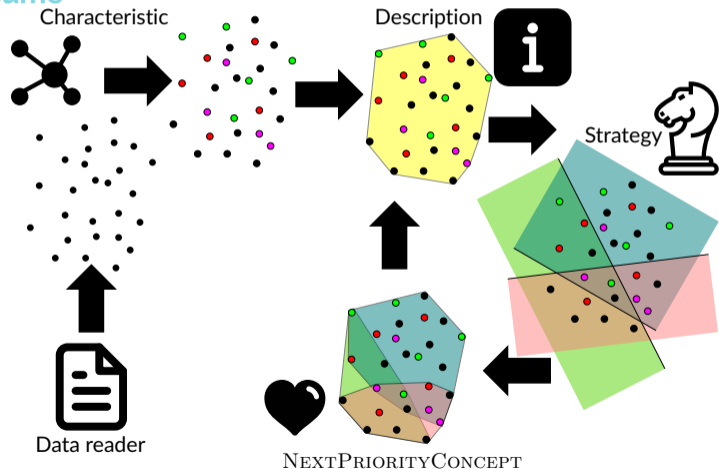
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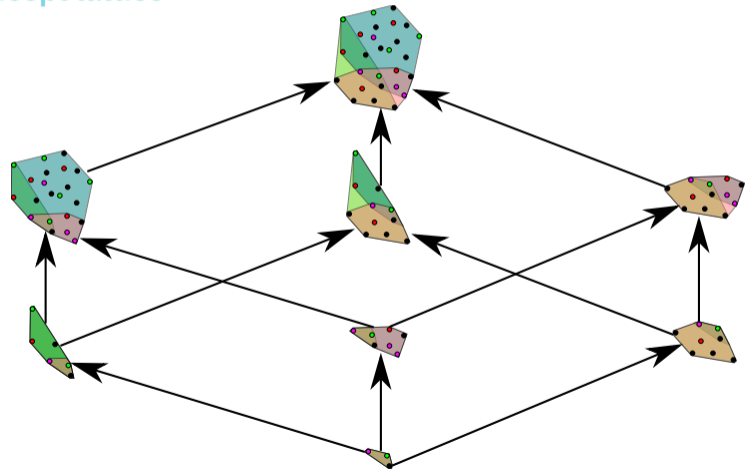


Resume

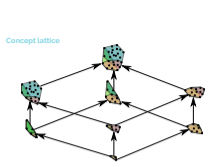


- data readers convert data files to context;
- subsets of individuals are described by sets of predicates called descriptions;
- strategies divide individuals into subsets;
- the NEXTPRIORITYCONCEPT algorithm maintains the notion of **Lattice** during the process;
- the lattice can be converted into a minimum and consistent **Basis of rules**.

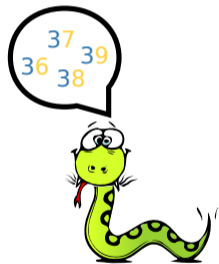
Concept lattice



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└ Concept lattice



Architecture



Core

The **GALACTIC core** defines the core library, it contains the basic operations and data structures and it implements the new generation algorithm (NEXTPRIORITYCONCEPT) inspired from pattern structures.

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- written for python >= 3.6
- the NEXTPRIORITYCONCEPT algorithm will be published in an international journal this autumn.

Sergei Kuznetsov was invited to the L3i in 2016, and after our discussions, we managed to propose this new algorithm.



Characteristic Plugins

Definition

Characteristic plugins define characteristics such as numerical characteristics, boolean characteristics.



- Existing characteristic plugins:
- ▶ Chain characteristics;
 - ▶ Sequence characteristics.
 - ▶ Triadic characteristics.
- In preparation:
- ▶ Graph characteristics.







Description Plugins

Definition

Description plugins define predicates and description spaces used to represent and to define data precisely.



Existing description plugins:

- ▶  *Boolean* descriptions;
- ▶  *Logical* descriptions;
- ▶  *Categorical* descriptions;
- ▶  *Numerical* descriptions;
- ▶  *String* descriptions using regex;
- ▶  *String* descriptions using distances;

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GALACTIC architecture

- └ Architecture
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 - ▶  Triadic descriptions.
- In preparation:
- ▶  Graph descriptions.

Strategy Plugins

Definition

Strategy plugins define the way used to explore data, it uses descriptions to generate predecessors for each concept in the lattice.



Existing strategy plugins:

- ▶ Boolean strategy;
- ▶ Logical strategy;
- ▶ Categorical strategy;
- ▶ Numerical basic strategy;
- ▶ Numerical quantile strategy;
- ▶ String strategy;
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



GALACTIC architecture

- └ Architecture
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 - └ Strategy Plugins


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Strategy Plugins

Definition

Strategy plugins define the way used to explore data, it uses descriptions to generate predecessors for each node in the lattice.



There are 3 \triangle meta-strategies in the core library:

- ▶ ∇ *Limit filter* which limits the predecessors to those whose measure does not exceed the limit;
- ▶ ∇ *Selection filter* which selects the best or the worst predecessors;
- ▶ \odot *Conditioned strategy* which triggers the execution of inner strategies when some conditions are met.

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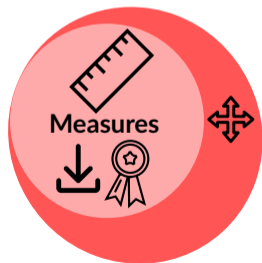
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Measure Plugins

Definition

Measure plugins are parameters of the *filter strategies* predefined in the core library.



There are 3 measures in the core library:

- ▶ \downarrow predecessor *Cardinality*;
- ▶ \uparrow successor *Cardinality*;
- ▶ \star *Confidence*.

One measure plugin has been developed:

- ▶ \star *Entropy* of the predecessor relatively to the successor.

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Data Reader Plugins

Definition

Data readers plugins are used to read different types of data files. The *core* engine detects the file type using its extension.



Existing data reader plugins are:

- ▶ *YAML*
- ▶ *JSON*
- ▶ *CSV*
- ▶ *TOML*
- ▶ *INI*
- ▶ *TXT*
- ▶ *SLF*
- ▶ *DAT*
- ▶ *CXT*

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Localization Plugins

Definition

Localization plugins are used for translating the applications to other languages.
The basic language is English.

- ▶  French translation of the **GALACTIC** applications.

2023-01-17 **GALACTIC** architecture
└─ Architecture
 └─ Plugins
 └─ Localization Plugins

Applications

Definition

Applications are developed for using the library; they are the interface of the user.



Existing applications are:

- ▶ **GALACTIC Laser**: for constructing the lattice and exploring data;
- ▶ **GALACTIC Explorer**: for exploring interactively the constructed lattice;
- ▶ **GALACTIC Ruler**: for extracting implication rules;
- ▶ **GALACTIC Fire**: for executing a system of rules.

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Jupyter notebooks



jupyter notebooks

The library and its plugins are developed for an easy integration into *jupyter notebooks*:

- ▶ drawing lattices;
- ▶ displaying reduced contexts;
- ▶ displaying basis of rules;
- ▶ ...

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└─ Architecture
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- ▶ ...

Collaborative version control



git

The library is developed using the collaboration tool `git`, in the `gitlab` of the university. We are using

- ▶ **`pylint`** and **`flake8`** (with plugins) for testing code quality;
- ▶ **`tox`** for generating tests.

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GALACTIC architecture

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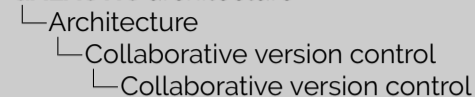
gitlab-runners

Using *gitlab-runners*, the code is automatically recompiled and rebuilt and tests are ran.

- ▶ **core**: 80 python files; 11949 python lines; 8187 comment lines; 4194 blank lines; 8% unit test coverage;
- ▶ **plugins**: 136 python files; 7451 python lines; 6634 comment lines; 2523 blank lines; 17% unit test coverage;
- ▶ **6 guides** (installation, user, practice, experiments, developer, continous integration/deployment)

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GALACTIC architecture



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Digits example

In this example the set of objects is integers from 0 to 9:

$$G = \{0, 1, 2, 3, 4, 5, 6, 7, 8, 9\}$$

and the set of attributes are the mathematical properties:

$$M = \{even, odd, composite, prime, square\}.$$

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and the set of attributes are the mathematical properties:
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Digits example

| digits | even | odd | composite | prime | square |
|--------|------|-----|-----------|-------|--------|
| 0 | x | | x | | x |
| 1 | | x | | | x |
| 2 | x | | | x | |
| 3 | | x | | x | |
| 4 | x | | x | | x |
| 5 | | x | | x | |
| 6 | x | | x | | |
| 7 | | x | | x | |
| 8 | x | | x | | |
| 9 | | x | x | | x |

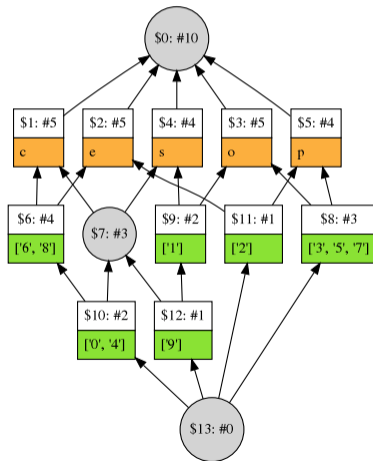
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Digits example

| digits | even | odd | composite | prime | square |
|--------|------|-----|-----------|-------|--------|
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| 2 | x | | | x | |
| 3 | | x | | x | |
| 4 | x | | x | | x |
| 5 | | x | | x | |
| 6 | x | | x | | |
| 7 | | x | | x | |
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| 9 | | x | x | | x |

Digits example

Using the Boolean strategy we obtain the following lattice.



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└─ Examples
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Digits example
Using the Boolean strategy we obtain the following lattice.



What's the Boolean strategy? Precise that it corresponds to the "classical" concept lattice.

Iris example

- ▶ this example consists of the iris flower data set, introduced by Ronald Fisher in 1936, represented by 150 samples from three species of Iris; setosa, virginica and versicolor;
- ▶ four features were measured from each sample: the length and the width of the sepals and petals, in centimeters.

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Iris example

This table shows a part of the data:

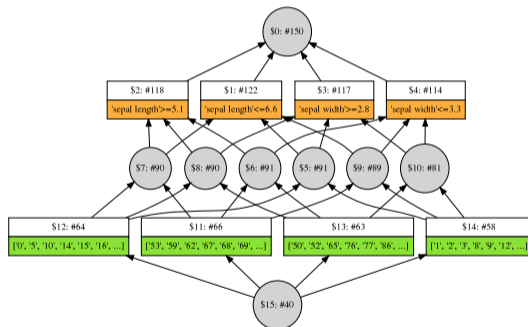
| sepal length | sepal width | petal length | petal width | class |
|--------------|-------------|--------------|-------------|-----------------|
| 5.1 | 3.5 | 1.4 | 0.2 | Iris-setosa |
| 7.0 | 3.2 | 4.7 | 1.4 | Iris-versicolor |
| 6.4 | 3.2 | 4.5 | 1.5 | Iris-versicolor |
| 5.8 | 2.7 | 5.1 | 1.9 | Iris-virginica |

This table shows a part of the data:

| sepal length | sepal width | petal length | petal width | class |
|--------------|-------------|--------------|-------------|-----------------|
| 5.1 | 3.5 | 1.4 | 0.2 | Iris-setosa |
| 7.0 | 3.2 | 4.7 | 1.4 | Iris-versicolor |
| 6.4 | 3.2 | 4.5 | 1.5 | Iris-versicolor |
| 5.8 | 2.7 | 5.1 | 1.9 | Iris-virginica |

Iris example

Using different kinds of strategy we can explore the iris data set to obtain different results.

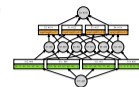


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Iris example

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Conclusion

- ▶ the version 0.4 was published on January 8th, 2022;
 - ▶ <https://galactic.univ-lr.fr>
 - ▶ <https://ml.univ-lr.fr/sympa/info/galactic>
- ▶ the **GALACTIC** applications, the various manuals and documentation guides are available under certain conditions.

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Perspectives

- ▶ plugins for sequences (characteristics and strategies):
 - ▶ trajectories, and sequences of terms in text mining;
 - ▶ DA3T project and two thesis: 2018, 2019;
- ▶ maturation of **GALACTIC**:
 - ▶ nicer interface;
 - ▶ nicer visualisation of characteristics into the concepts;
 - ▶ possibility for the user to specify the strategy in an interactive way for each concept.
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Thank you!
Questions!?