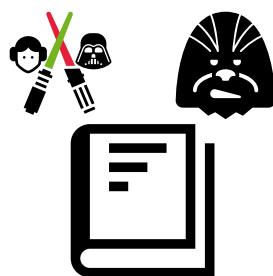


---

# galactic experiment guide

The Galactic Organization <[contact@thegalactic.org](mailto:contact@thegalactic.org)>



0.3.0

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## 1 Introduction



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This experiment guide is a collection of all the jupyter notebooks present in the data projects.

All lines

 | print("test")

are python input.

And all lines

 | test

are python output.

By default the following colors are used for drawing concept lattices:

-  for generators;
-  for pseudo-generators;
-  for prototypes.

## 2 Sample data

### 2.1 Iris data set

#### 2.1.1 Iris data set, limiting the cardinality of concepts

The lattice construction from the Iris data set could lead to very big lattice (several million concepts).

We can use the Population.from\_file function to load a population in memory and the Explorer.from\_file function to load a set of strategies described in a yaml file.

We can construct a concept lattice from a population and a list of strategies using the ConceptLattice class.

The Hasse diagram of a lattice can be visualized using the HasseDiagram class, the reduced context can be displayed using the BinaryTable class and the summary table can be displayed using the ConceptTable class.

 | from galactic.population import Population  
from galactic.concepts import ConceptLattice, ConceptRenderer,  
  ↳ ConceptTable  
from galactic.algebras.poset import HasseDiagram  
from galactic.algebras.relational import BinaryTable  
from galactic.strategies import Explorer  
from project\_data import share\_path

```
Python import sys
import os
data_path = os.path.join(
    share_path,
    "sample",
    "data",
    "iris",
    "iris.csv"
)
with open(data_path, "r") as data_file:
    population = Population.from_file(data_file)
population
<galactic.population.Population at 0x7f49a8b9d200>
len(population)
150
```

### 2.1.1.1 Limiting the cardinality of concepts to 110

```
Python explorer_path = os.path.join(
    share_path,
    "sample",
    "data",
    "iris",
    "explorer-110.yaml"
)
with open(explorer_path, "r") as explorer_file:
    print(explorer_file.read())
    explorer_file.seek(0)
    explorer = Explorer.from_file(explorer_file)

characteristics:
- &id001 !characteristic.numerical.Number
  characteristic: !characteristic.core.Key
    name: "sepal length"
- &id002 !characteristic.numerical.Number
  characteristic: !characteristic.core.Key
    name: "sepal width"
- &id003 !characteristic.numerical.Number
  characteristic: !characteristic.core.Key
    name: "petal length"
- &id004 !characteristic.numerical.Number
  characteristic: !characteristic.core.Key
    name: "petal width"
- &id005 !characteristic.categorized.Category
  characteristic: !characteristic.core.Key
```

```
name: "class"

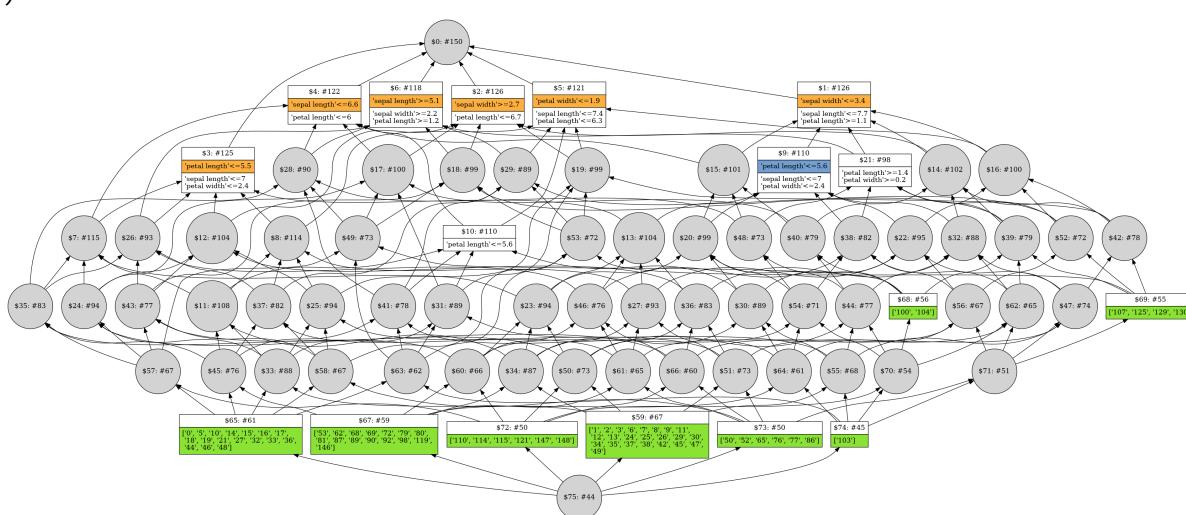
descriptions:
- !description.numerical.hull.Numerical
  - *id001
- !description.numerical.hull.Numerical
  - *id002
- !description.numerical.hull.Numerical
  - *id003
- !description.numerical.hull.Numerical
  - *id004
- !description.categorized.subset.Category
  - *id005

strategies:
- !strategy.core.LimitFilter
  arguments:
    - !strategy.numerical.hull.basic.Normal
      arguments:
        - *id001
    - !strategy.numerical.hull.basic.Normal
      arguments:
        - *id002
    - !strategy.numerical.hull.basic.Normal
      arguments:
        - *id003
    - !strategy.numerical.hull.basic.Normal
      arguments:
        - *id004
  params:
    measure: !measure.core.Cardinality
    limit: 110

explorer
<galactic.strategies.Explorer at 0x7f49dbf43b80>
lattice = ConceptLattice.create(
  population=population,
  descriptions=explorer.descriptions,
  strategies=explorer.strategies
)
```



```
HasseDiagram(
    lattice,
    domain_renderer=ConceptRenderer(
        show_predicates=True,
        compact=False
    )
)
```



```
BinaryTable(
    lattice.reduced_context,
    domain_renderer=ConceptRenderer(join_irreducible=True),
    co_domain_renderer=ConceptRenderer(meet_irreducible=True)
)
```



	@0	@1	@2	@3	@4	@5	@6
[‘1’, ‘2’, ‘3’, ‘6’, ‘7’, ‘8’, ...]		✓	✓	✓	✓	✓	✓
[‘0’, ‘5’, ‘10’, ‘14’, ‘15’, ‘16’, ...]		✓	✓	✓	✓	✓	✓
[‘20’, ‘23’, ‘28’, ‘31’, ‘39’, ‘51’, ...]		✓	✓	✓	✓	✓	✓
[‘20’, ‘23’, ‘28’, ‘31’, ‘39’, ‘51’, ...]		✓	✓	✓	✓		✓

['20', '23', '28', '31', '39', '50', ...]	✓		✓	✓	✓	✓	✓
['20', '23', '28', '31', '39', '51', ...]		✓	✓	✓		✓	✓
['20', '23', '28', '31', '39', '50', ...]		✓		✓	✓		✓
['20', '23', '28', '31', '39', '51', ...]	✓		✓	✓	✓		



## ConceptTable(lattice)



Concept	Individuals	Predicates
0		'sepal length'>=4.3 'sepal length'<=7.9 'sepal width'>=2 'sepal width'<=4.4 'petal length'>=1 'petal length'<=6.9 'petal width'>=0.1 'petal width'<=2.5 class <= {'Iris-virginica', 'Iris-versicolor', 'Iris-setosa'}
1		'sepal length'<=7.7 'sepal width'<=3.4 'petal length'>=1.1

```
2           'sepal  
width'>=2.7'petal  
length'<=6.7  
  
3           'sepal  
length'<=7'petal  
length'<=5.5'petal  
width'<=2.4  
  
4           'sepal  
length'<=6.6'petal  
length'<=6  
  
5           'sepal  
length'<=7.4'petal  
length'<=6.3'petal  
width'<=1.9  
  
6           'sepal  
length'>=5.1'sepal  
width'>=2.2'petal  
length'>=1.2  
  
9           'sepal  
length'<=7'petal  
length'<=5.6'petal  
width'<=2.4  
  
10          'petal length'<=5.6  
  
18          ['109', '117', '131']  
  
21          118           'petal  
length'>=1.4'petal  
width'>=0.2  
  
33          ['4', '22', '40',  
        '43']  
  
34          ['41', '57', '60',  
        '93', '106']  
  
39          ['102', '105', '120',  
        '122', '124', '135',  
        ...]
```

52	108
59	<code>['1', '2', '3', '6',  '7', '8', ...]</code>
60	113
62	140
64	134
65	<code>['0', '5', '10',  '14', '15', '16',  ...]</code>
66	<code>['112', '139', '141',  '145']</code>
67	<code>['53', '62', '68',  '69', '72', '79',  ...]</code>
68	<code>['100', '104']</code>
69	<code>['107', '125', '129',  '130']</code>
70	<code>['128', '132', '136']</code>
72	<code>['110', '114', '115',  '121', '147', '148']</code>
73	<code>['50', '52', '65',  '76', '77', '86']</code>
74	103
75	<code>['20', '23', '28',  '31', '39', '51',  ...]</code>

---

### 2.1.1.2 Limiting the cardinality of concepts to 100 and mixing categorized characteristic and numerical characteristic



```
explorer_path = os.path.join(
    share_path,
    "sample",
    "data",
    "iris",
    "explorer-class.yaml"
)

with open(explorer_path, "r") as explorer_file:
    print(explorer_file.read())
    explorer_file.seek(0)
    explorer = Explorer.from_file(explorer_file)
```



#### characteristics:

- &#id001 !characteristic.numerical.Number  
characteristic: !characteristic.core.Key  
name: "sepal length"
- &#id002 !characteristic.numerical.Number  
characteristic: !characteristic.core.Key  
name: "sepal width"
- &#id003 !characteristic.numerical.Number  
characteristic: !characteristic.core.Key  
name: "petal length"
- &#id004 !characteristic.numerical.Number  
characteristic: !characteristic.core.Key  
name: "petal width"
- &#id005 !characteristic.categorized.Category  
characteristic: !characteristic.core.Key  
name: "class"  
domain:
  - Iris-setosa
  - Iris-versicolor
  - Iris-virginica

#### descriptions:

- !description.numerical.hull.Numerical
  - \*id003
- !description.numerical.hull.Numerical
  - \*id004
- !description.categorized.subset.Category
  - \*id005

#### strategies:

- !strategy.core.LimitFilter

#### arguments:

```
- !strategy.numerical.hull.basic.Normal
  arguments:
  - *id003
  params:
    coefficient: 1
- !strategy.numerical.hull.basic.Normal
  arguments:
  - *id004
  params:
    coefficient: 1
  params:
    measure: !measure.core.Cardinality
    limit: 100
- !strategy.categorized.subset.basic.Category
  - *id005
```



explorer



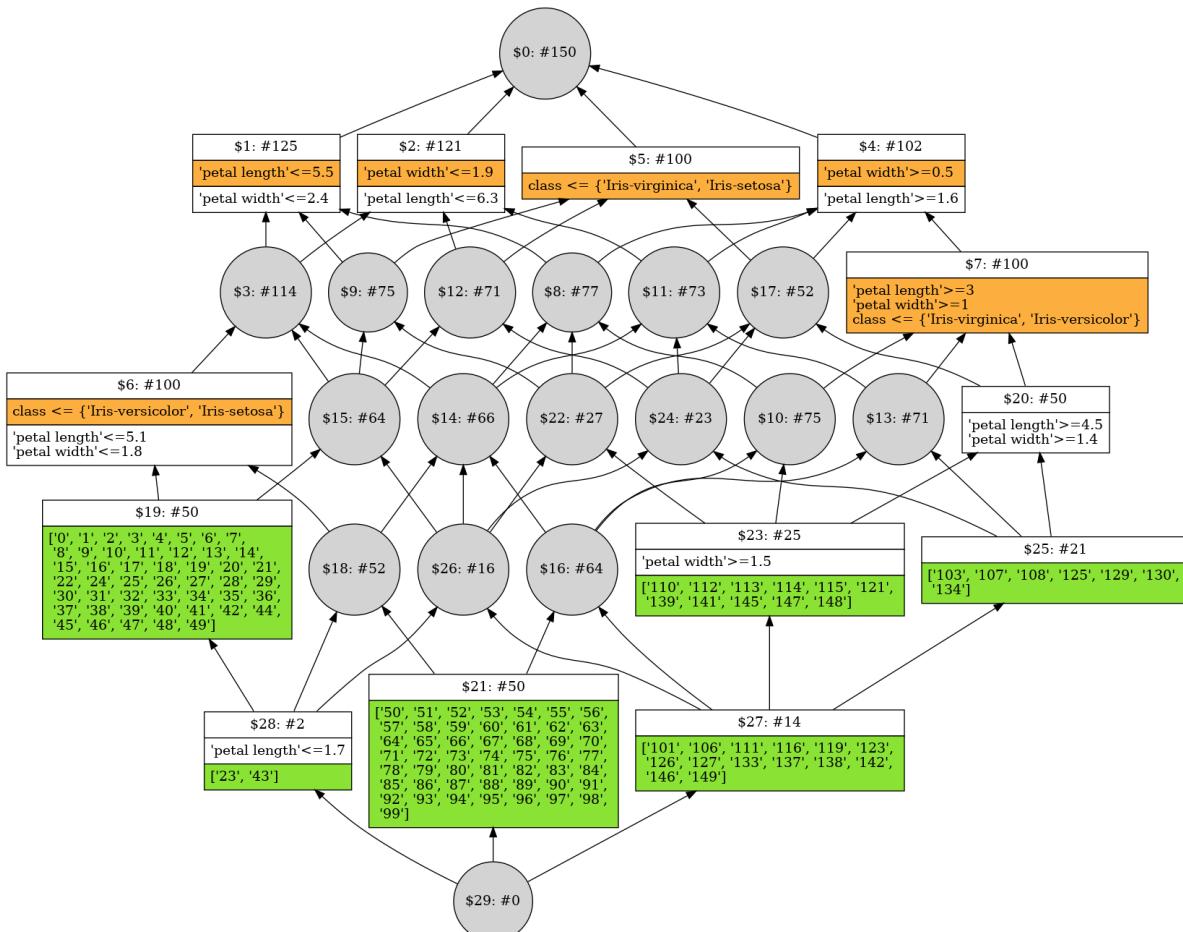
&lt;galactic.strategies.Explorer at 0x7f49a8bc12c0&gt;



```
lattice = ConceptLattice.create(
    population=population,
    descriptions=explorer.descriptions,
    strategies=explorer.strategies
)
```



```
HasseDiagram(
    lattice,
    domain_renderer=ConceptRenderer(
        show_predicates=True,
        compact=False
    )
)
```



```

BinaryTable(
    lattice.reduced_context,
    domain_renderer=ConceptRenderer(join_irreducible=True),
    co_domain_renderer=ConceptRenderer(meet_irreducible=True)
)

```

	@0	@1	@2	@3	@4	@5
[‘50’, ‘51’, ‘52’, ‘53’, ‘54’, ‘55’, ...]	✓	✓	✓		✓	✓
[‘101’, ‘106’, ‘111’, ‘116’, ‘119’, ‘123’, ...]	✓	✓	✓	✓	✓	
[‘23’, ‘43’]	✓	✓	✓	✓		✓
[‘0’, ‘1’, ‘2’, ‘3’, ‘4’, ‘5’, ...]		✓	✓	✓	✓	✓

```
[‘101’, ‘106’, ✓ ✓ ✓ ✓
‘110’, ‘111’,
‘112’, ‘113’,
...]
```

```
[‘101’, ‘103’, ✓ ✓ ✓ ✓
‘106’, ‘107’,
‘108’, ‘111’,
...]
```



```
ConceptTable(lattice,concept_width=5,individual_width=20,predicate_width=40)
```



Concept	Individuals	Predicates
0		'petal length'>=1'petal length'<=6.9'petal width'>=0.1'petal width'<=2.5
1		'petal length'<=5.5'petal width'<=2.4
2		'petal length'<=6.3'petal width'<=1.9
4		'petal length'>=1.6'petal width'>=0.5
5		class <= {'Iris-virginica', 'Iris-setosa'}
6		'petal length'<=5.1'petal width'<=1.8class <= {'Iris-versicolor', 'Iris-setosa'}
7		'petal length'>=3'petal width'>=1class <= {'Iris-virginica', 'Iris-versicolor'}
19	['0', '1', '2', '3', '4', '5', ...]	'petal length'<=1.9'petal width'<=0.6class <= {'Iris-setosa'}
20	['100', '102', '104', '105', '109', '117', ...]	'petal length'>=4.5'petal width'>=1.4class <= {'Iris-virginica'}
21	['50', '51', '52', '53', '54', '55', ...]	class <= {'Iris-versicolor'}

```
23      ['110', '112',           'petal width'>=1.5
     '113', '114', '115',
     '121', ...]

25      ['103', '107',
     '108', '125', '129',
     '130', ...]

27      ['101', '106',
     '111', '116', '119',
     '123', ...]

28      ['23', '43']           'petal length'<=1.7

29                  'petal length'>=nan'petal
                           length'<=nan'petal width'>=nan'petal
                           width'<=nanclass <= {}
```

### 2.1.1.3 Using a categorized characteristic and the entropy measure

```
explorer_path = os.path.join(
    share_path,
    "sample",
    "data",
    "iris",
    "explorer-entropy.yaml"
)

with open(explorer_path, "r") as explorer_file:
    print(explorer_file.read())
    explorer_file.seek(0)
    explorer = Explorer.from_file(explorer_file)
```

 characteristics:

- &id001 !characteristic.numerical.Number  
characteristic: !characteristic.core.Key  
name: "sepal length"
- &id002 !characteristic.numerical.Number  
characteristic: !characteristic.core.Key  
name: "sepal width"
- &id003 !characteristic.numerical.Number  
characteristic: !characteristic.core.Key  
name: "petal length"
- &id004 !characteristic.numerical.Number  
characteristic: !characteristic.core.Key  
name: "petal width"
- &id005 !characteristic.categorized.Category  
characteristic: !characteristic.core.Key  
name: "class"

## descriptions:

- !description.numerical.hull.Numerical
  - \*id001
- !description.numerical.hull.Numerical
  - \*id002
- !description.numerical.hull.Numerical
  - \*id003
- !description.numerical.hull.Numerical
  - \*id004
- !description.categorized.subset.Category
  - \*id005

## strategies:

- !strategy.core.SelectionFilter
  - arguments:
    - !strategy.numerical.hull.quantile.Quantile
      - arguments:
        - \*id001
      - params:
        - lower: true
        - count: null
    - !strategy.numerical.hull.quantile.Quantile
      - arguments:
        - \*id001
      - params:
        - lower: false

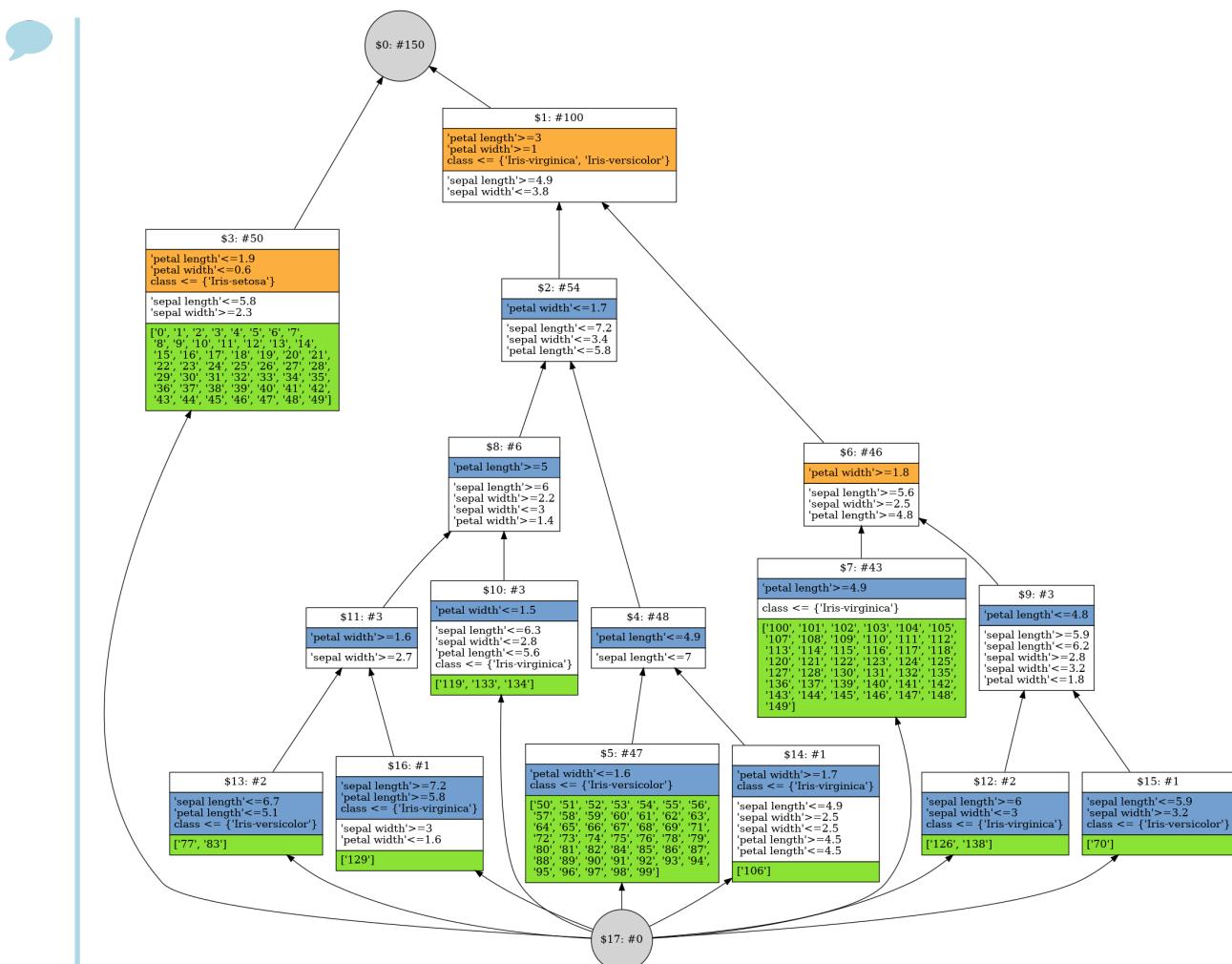
```
    count: null
- !strategy.numerical.hull.quantile.Quantile
  arguments:
  - *id002
  params:
    lower: true
    count: null
- !strategy.numerical.hull.quantile.Quantile
  arguments:
  - *id002
  params:
    lower: false
    count: null
- !strategy.numerical.hull.quantile.Quantile
  arguments:
  - *id003
  params:
    lower: true
    count: null
- !strategy.numerical.hull.quantile.Quantile
  arguments:
  - *id003
  params:
    lower: false
    count: null
- !strategy.numerical.hull.quantile.Quantile
  arguments:
  - *id004
  params:
    lower: true
    count: null
- !strategy.numerical.hull.quantile.Quantile
  arguments:
  - *id004
  params:
    lower: false
    count: null
params:
  measure: !measure.entropy.Entropy
  category: *id005
  maximize: false
  strict: true
```

```

lattice = ConceptLattice.create(
    population=population,
    descriptions=explorer.descriptions,
    strategies=explorer.strategies
)

HasseDiagram(
    lattice,
    domain_renderer=ConceptRenderer(
        show_predicates=True,
        compact=False
    )
)

```



## 3 Sequence experiments

### 3.1 String data

#### 3.1.1 Chemical Formula example

We can use the `Population.from_file` function to load a population in memory and the `Explorer.from_file` function to load a set of strategies described in a `yaml` file.

We can construct a concept lattice from a population and a list of strategies using the `Lattice` class.

The Hasse diagram of a lattice can be visualized using the `HasseDiagram` class, the reduced context can be displayed using the `ReducedContext` class and the summary table can be displayed using the `Table` class.

```
from galactic.population import Population
from galactic.strategies import Explorer
from galactic.concepts import (
    ConceptLattice,
    ConceptRenderer,
    ConceptTable
)
from galactic.algebras.poset import HasseDiagram
from galactic_strategy_string_match_basic import (
    CompleteMatchStrategy,
    PrefixMatchStrategy
)
from galactic_description_string_match import (
    PrefixDescription
)
from galactic.strategies import LimitFilter
from galactic.characteristics import Key
from galactic.strategies import Cardinality
from galactic.algebras.relational import BinaryTable
from galactic_characteristic_string import String
from project_data import share_path
import sys
import os

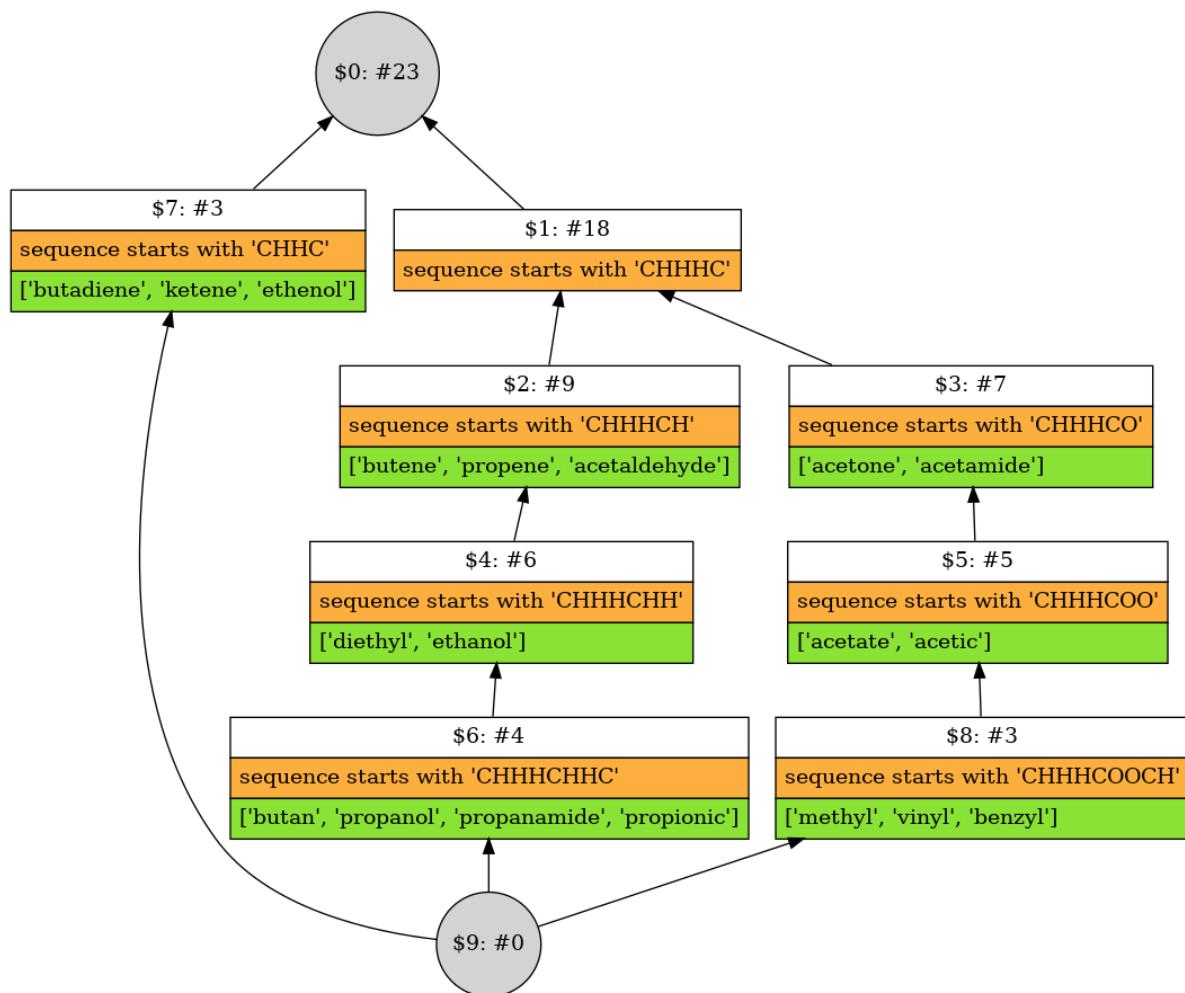
data_path = os.path.join(
    share_path,
    "sequence",
    "data",
    "examples",
    "string-example-chemicalformula-23.yaml"
)
with open(data_path, "r") as data_file:
    population = Population.from_file(data_file)
len(population)
```



23

```
characteristics = [
    String(characteristic=Key(name="sequence")))
]
descriptions = [
    PrefixDescription(characteristics[0])
]
strategies = [
    LimitFilter(
        PrefixMatchStrategy(characteristics[0]),
        measure=Cardinality(),
        limit=3
    )
]
lattice = ConceptLattice.create(
    population=population,
    descriptions=descriptions,
    strategies=strategies
)
HasseDiagram(
    lattice,
    domain_renderer=ConceptRenderer()
)
```





```
display(*lattice.domain)
```



### Predicates:

- sequence starts with 'CHH'

### Individuals:

- butadiene
- ketene
- ethenol
- formaldehyde
- ethylene
- propyne
- butene
- ...

### Predicates:

- sequence starts with 'CHHHC'

### Individuals:

- propyne
- butene
- propene
- acetaldehyde
- butan
- propanol
- propanamide
- ...

**Predicates:**

- sequence starts with 'CHHHCH'

**Individuals:**

- butene
- propene
- acetaldehyde
- butan
- propanol
- propanamide
- propionic
- ...

**Predicates:**

- sequence starts with 'CHHHCO'

**Individuals:**

- acetone
- methyl
- acetamide
- acetate
- vinyl
- benzyl
- acetic

**Predicates:**

- sequence starts with 'CHHHCHH'

**Individuals:**

- butan
- propanol
- propanamide

- propionic
- diethyl
- ethanol

**Predicates:**

- sequence starts with 'CHHHCOO'

**Individuals:**

- methyl
- acetate
- vinyl
- benzyl
- acetic

**Predicates:**

- sequence starts with 'CHHHCHHC'

**Individuals:**

- butan
- propanol
- propanamide
- propionic

**Predicates:**

- sequence starts with 'CHHC'

**Individuals:**

- butadiene
- ketene
- ethenol

**Predicates:**

- sequence starts with 'CHHCOOCH'

**Individuals:**

- methyl
- vinyl
- benzyl

**Predicates:**

- sequence starts with {}

**Individuals:**

### 3.1.2 Verbs example



```
data_path = os.path.join(
    share_path,
    "sequence",
    "data",
    "examples",
    "string-example-conjugation-13.yaml"
)
with open(data_path, "r") as data_file:
    population = Population.from_file(data_file)
len(population)
```

 13

```
explorer_path = os.path.join(
    share_path,
    "sequence",
    "data",
    "explorers",
    "string",
    "complete-match-basic-verbes.yaml"
)
with open(explorer_path, "r") as explorer_file:
    print(explorer_file.read())
    explorer_file.seek(0)
    explorer = Explorer.from_file(explorer_file)
```

 characteristics:

- &id001 !characteristic.string.String  
characteristic: !characteristic.core.Key  
name: "infinitif"
- &id002 !characteristic.string.String  
characteristic: !characteristic.core.Key  
name: "je"
- &id003 !characteristic.string.String  
characteristic: !characteristic.core.Key  
name: "tu"
- &id004 !characteristic.string.String  
characteristic: !characteristic.core.Key  
name: "il"
- &id005 !characteristic.string.String  
characteristic: !characteristic.core.Key  
name: "nous"
- &id006 !characteristic.string.String  
characteristic: !characteristic.core.Key  
name: "vous"
- &id007 !characteristic.string.String

```
characteristic: !characteristic.core.Key
  name: "ils"

descriptions:
- !description.string.Complete
  arguments:
  - *id001
- !description.string.Complete
  arguments:
  - *id002
- !description.string.Complete
  arguments:
  - *id003
- !description.string.Complete
  arguments:
  - *id004
- !description.string.Complete
  arguments:
  - *id005
- !description.string.Complete
  arguments:
  - *id006
- !description.string.Complete
  arguments:
  - *id007

strategies:
- !strategy.string.match.basic.Complete
  arguments:
  - *id001
- !strategy.string.match.basic.Complete
  arguments:
  - *id002
- !strategy.string.match.basic.Complete
  arguments:
  - *id003
- !strategy.string.match.basic.Complete
  arguments:
  - *id004
- !strategy.string.match.basic.Complete
  arguments:
  - *id005
- !strategy.string.match.basic.Complete
```

```
arguments:  
- *id006  
- !strategy.string.match.basic.Complete  
arguments:  
- *id007
```

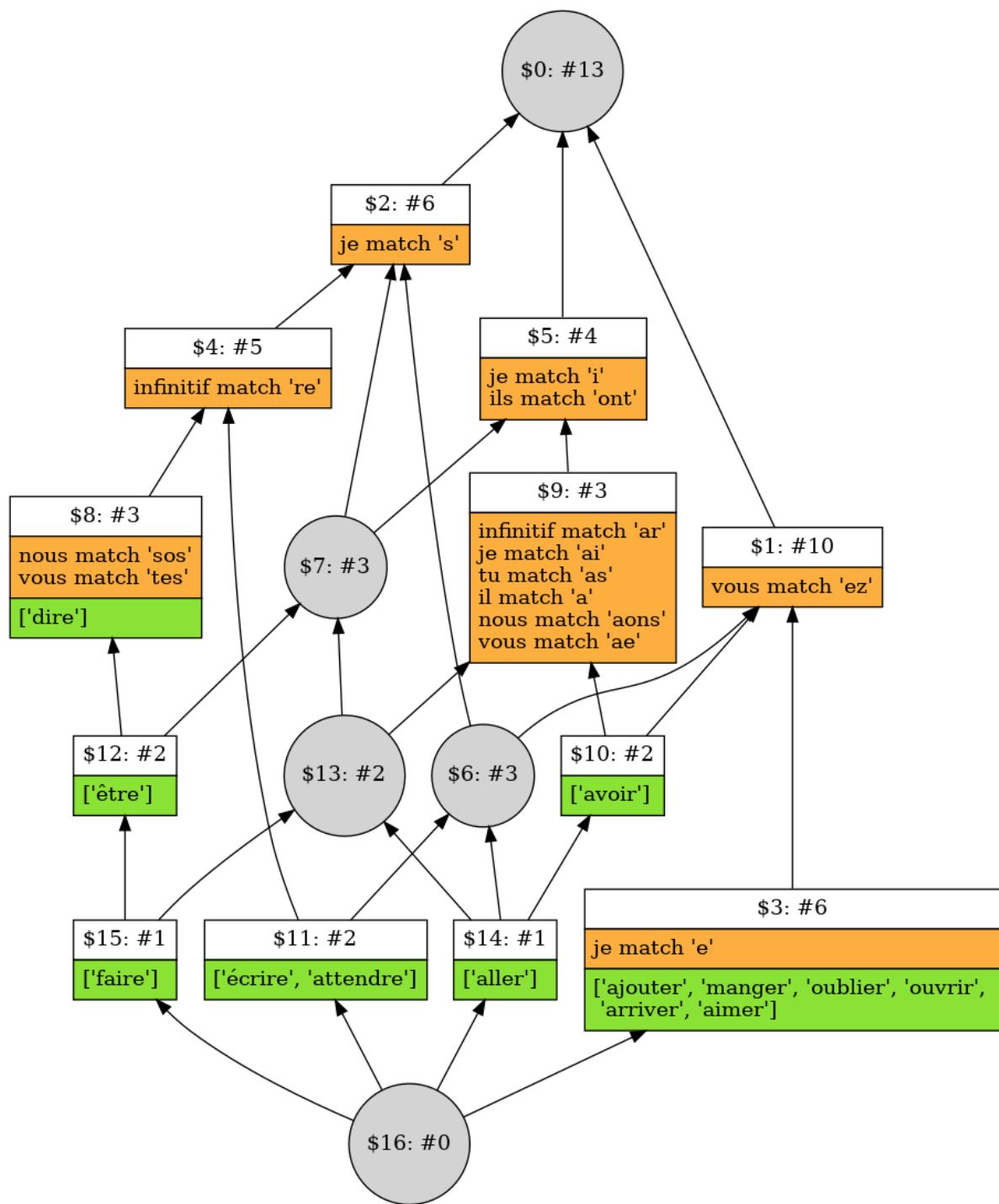


```
lattice = ConceptLattice.create(  
    population=population,  
    descriptions=explorer.descriptions,  
    strategies=explorer.strategies  
)
```



```
HasseDiagram(  
    lattice,  
    domain_renderer=ConceptRenderer()  
)
```





```
BinaryTable(
    lattice.reduced_context,
    domain_renderer=ConceptRenderer(join_irreducible=True),
    co_domain_renderer=ConceptRenderer(meet_irreducible=True)
)
```

	@0	@1	@2	@3	@4	@5	@6
[‘ajouter’, ‘manger’, ‘oublier’, ‘ouvrir’, ‘arriver’, ‘aimer’]		✓					✓
[‘écrire’, ‘at- tendre’]	✓	✓				✓	
aller	✓	✓	✓	✓			
faire	✓		✓	✓	✓	✓	✓
[‘faire’, ‘être’]	✓		✓		✓	✓	
[‘avoir’, ‘aller’]		✓	✓	✓			
[‘faire’, ‘être’, ‘dire’]	✓				✓	✓	



ConceptTable(lattice)

Concept	Individuals	Predicates
0		infinitif match 'r'je match {}tu match 's'nous match 'os'veous match 'e'ils match 'nt'
1		nous match 'ons'veous match 'ez'
2		infinitif match 'e'je match 's'

3		['ajouter', 'manger', 'je match 'e'tu match 'oublier', 'ouvrir', 'es'il match 'e'ils 'arriver', 'aimer'] match 'ent'
4		infinitif match 're'
5		je match 'i'il match {}ils match 'ont'
7		je match 'is'
8	dire	il match 't'nous match 'sos'veous match 'tes'
9		infinitif match 'ar'je match 'ai'tu match 'as'il match 'a'nous match 'aons'veous match 'ae'
10	avoir	vous match 'aez'
11		ils match 'ent' ['écrire', 'attendre']
12	être	
13		infinitif match 'ae'je match 'ais'
14	aller	infinitif match 'aller'je match 'vais'tu match 'vas'il match 'va'nous match 'allons'veous match 'allez'ils match 'vont'
15	faire	infinitif match 'aire'tu match 'ais'il match 'ait'nous match 'aisons'veous match 'aitez'

## 3.2 Chain data

### 3.2.1 Wine-City data set

The Wine-City dataset is issued from the museum data “La cité du vin” in Bordeaux, France (<https://www.laciteduvin.com/en>), gathered from the visits on a period of one year (May 2016 to May 2017). The museum is a large “open-space”, where visitors are free to explore the museum the way they want, without predetermined path. When they arrive at the museum, they receive a small personal device to detect whenever a visitor is close to an animation spot called a *module*. The museum contains 20 modules, so we can say that extracted sequences for this data is quite short. By extracting the sequences of activation of each module, we end up with a precise enough idea of what the visit looked like for each visitor of the museum.

The lattice construction from the Wine-City data set could lead to very big lattice (several hundred thousand concepts) and takes a lot of time to process. Here we select random portion from the dataset to test our strategies, also we may use the meta strategies to limit the generation of concepts according to the support or confidence.

We can use the `Population.from_file` function to load a population in memory and the `Explorer.from_file` function to load a set of strategies described in a `yaml` file.

We can construct a concept lattice from a population and a list of strategies using the `Lattice` class.

The Hasse diagram of a lattice can be visualized using the `HasseDiagram` class, the reduced context can be displayed using the `ReducedContext` class and the summary table can be displayed using the `Table` class.



```
from galactic.population import Population
from galactic.strategies import Explorer
from galactic.concepts import (
    ConceptRenderer,
    ConceptLattice,
    ConceptTable
)
from galactic.algebras.poset import HasseDiagram
from galactic.algebras.relational import BinaryTable
from project_data import share_path
```

```
import sys
import os
data_path = os.path.join(
    share_path,
    "sequence",
    "data",
    "examples",
    "chain-example-wine-city-20.yaml"
)
with open(data_path, "r") as data_file:
    population = Population.from_file(data_file)
population
len(population)
```

10

### 3.2.1.1 Simple Match Strategy

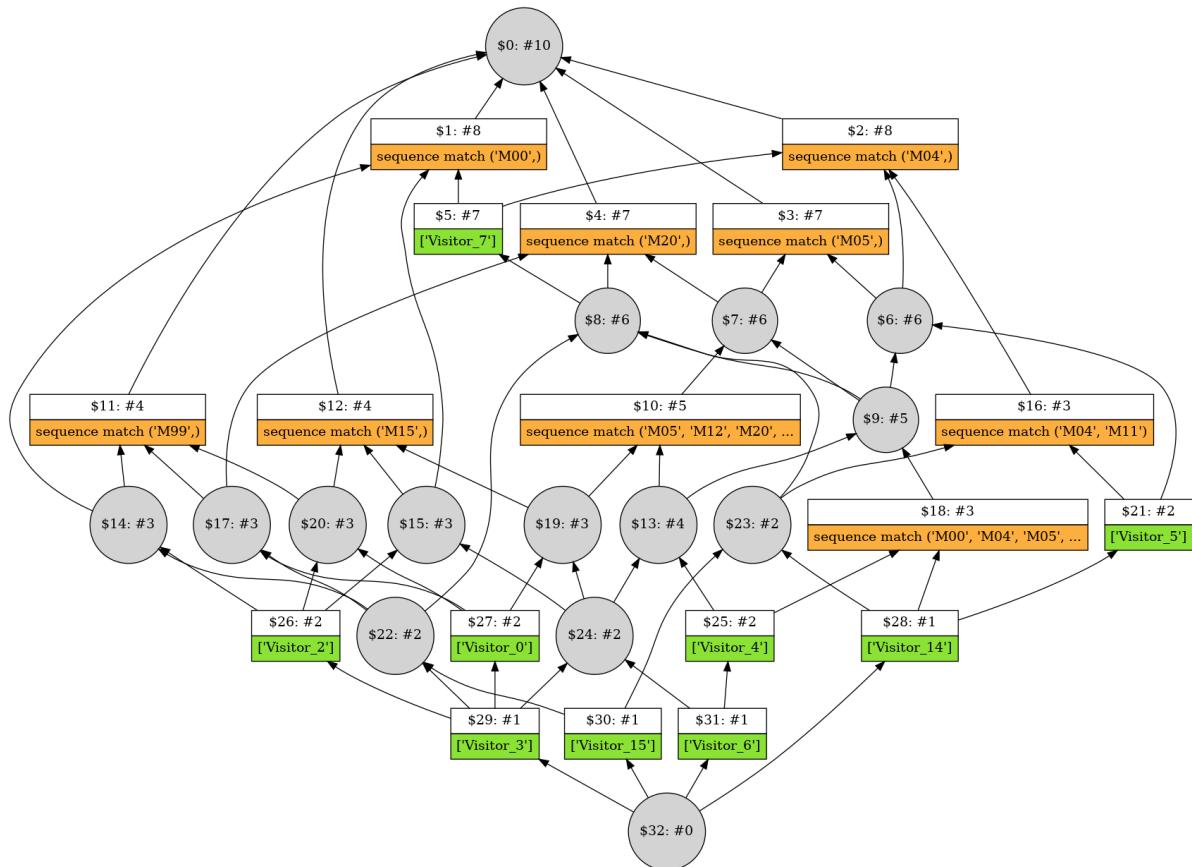
```
explorer_path = os.path.join(
    share_path,
    "sequence",
    "data",
    "explorers",
    "chain",
    "simple-match-basic.yaml"
)
with open(explorer_path, "r") as explorer_file:
    print(explorer_file.read())
    explorer_file.seek(0)
    explorer = Explorer.from_file(explorer_file)

characteristics:
- &#001 !characteristic.chain.Chain
    characteristic: !characteristic.core.Key
        name: "sequence"
descriptions:
- !description.chain.Simple
    - *id001
strategies:
- !strategy.chain.match.basic.Simple
arguments:
- *id001
params:
    length: 2
```

```
from galactic_strategy_chain_match_basic import (
    CompleteMatchStrategy,
    PrefixMatchStrategy
)
from galactic_description_chain_match import (
    CompleteDescription
)
from galactic.strategies import LimitFilter
from galactic_characteristic_chain import Chain
from galactic.characteristics import Key
from galactic.strategies import Cardinality

characteristics = [
    Chain(characteristic=Key(name="sequence")))
]
descriptions = [
    CompleteDescription(characteristics[0])
]
strategies = [
    LimitFilter(
        CompleteMatchStrategy(characteristics[0]),
        measure=Cardinality(),
        limit=2
    )
]

lattice = ConceptLattice.create(
    population=population,
    descriptions=descriptions,
    strategies=strategies
)
HasseDiagram(
    lattice,
    domain_renderer=ConceptRenderer()
)
```



```
BinaryTable(
    lattice.reduced_context,
    domain_renderer=ConceptRenderer(join_irreducible=True),
    co_domain_renderer=ConceptRenderer(meet_irreducible=True)
)
```

	@0	@1	@2	@3	@4	@5	@6	@7	@8	@9
['Visitor_4', 'Vis- itor_6']		✓	✓	✓	✓			✓		✓
Visitor_3	✓	✓	✓	✓	✓	✓	✓			✓
Visitor_14		✓	✓	✓	✓			✓	✓	
Visitor_15	✓		✓	✓	✓				✓	
['Visitor_5', 'Vis- itor_14']			✓	✓					✓	

['Visitor_0', 'Vis- itor_3']	✓	✓		✓	✓	✓	✓
['Visitor_2', 'Vis- itor_3']	✓		✓		✓		
['Visitor_3', 'Vis- itor_6']		✓	✓	✓	✓	✓	✓
['Visitor_1', 'Vis- itor_3', 'Vis- itor_4', 'Vis- itor_6', 'Vis- itor_7', 'Vis- itor_14', ...]		✓		✓			



ConceptTable(lattice)



Concept	Individuals	Predicates
0		sequence match {}
1		sequence match ('M00',)
2		sequence match ('M04',)
3		sequence match ('M05',)
4		sequence match ('M20',)
5	Visitor_7	sequence match ('M00', 'M04')

```
6      sequence match
('M04', 'M05')

7      sequence match
('M05', 'M12', 'M20')

8      sequence match
('M00', 'M04', 'M20')

9      sequence match
('M00', 'M04', 'M05',
'M12', 'M20')

10     sequence match
('M05', 'M12', 'M20',
'M23')

11     sequence match
('M99',)

12     sequence match
('M15',)

13     Visitor_1      sequence match
('M00', 'M04', 'M05',
'M12', 'M20', 'M23')

14     sequence match
('M00', 'M99')

15     sequence match
('M00', 'M15')

16     sequence match
('M04', 'M11')

17     sequence match
('M20', 'M99')

18     sequence match
('M00', 'M04', 'M05',
'M12', 'M20', 'M22')

19     sequence match
('M05', 'M07', 'M09',
'M12', 'M15', 'M20',
'M23')
```

```
20                                sequence match  
                                ('M15', 'M99')  
  
21        Visitor_5                sequence match  
                                ('M04', 'M05', 'M11')  
  
22                                sequence match  
                                ('M00', 'M03', 'M04',  
                                 'M17', 'M20', 'M99')  
  
23                                sequence match  
                                ('M00', 'M04', 'M10',  
                                 'M11', 'M20')  
  
24                                sequence match  
                                ('M00', 'M04', 'M05',  
                                 'M07', 'M09', 'M12',  
                                 'M15', 'M17', 'M19',  
                                 'M20', 'M23')  
  
25        Visitor_4                sequence match  
                                ('M00', 'M04', 'M05',  
                                 'M09', 'M12', 'M20',  
                                 'M22', 'M23')  
  
26        Visitor_2                sequence match  
                                ('M00', 'M15', 'M99')  
  
27        Visitor_0                sequence match  
                                ('M05', 'M07', 'M09',  
                                 'M12', 'M15', 'M20',  
                                 'M23', 'M99')  
  
28        Visitor_14               sequence match  
                                ('M00', 'M04', 'M05',  
                                 'M06', 'M10', 'M11',  
                                 'M12', 'M19', 'M20',  
                                 'M22')  
  
29        Visitor_3                sequence match  
                                ('M00', 'M03', 'M04',  
                                 'M05', 'M07', 'M08',  
                                 'M09', 'M12', 'M15',  
                                 'M17', 'M19', 'M20',  
                                 'M23', 'M99')
```

---

30	Visitor_15	sequence match ('M00', 'M03', 'M04', 'M10', 'M11', 'M17', 'M20', 'M99')
31	Visitor_6	sequence match ('M00', 'M04', 'M05', 'M06', 'M07', 'M09', 'M12', 'M14', 'M15', 'M17', 'M19', 'M20', 'M22', 'M23')
32		sequence match {}

---

### 3.2.1.2 Complete Match Strategy



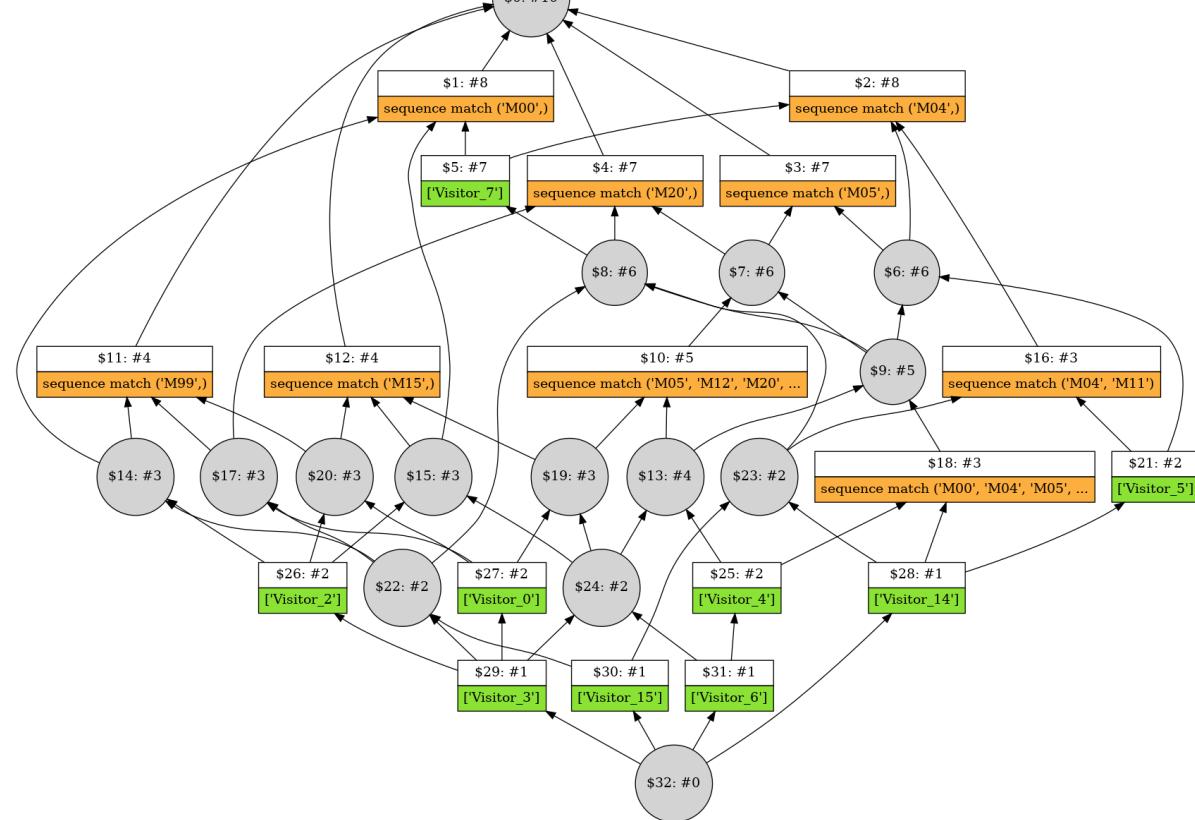
```
explorer_path = os.path.join(
    share_path,
    "sequence",
    "data",
    "explorers",
    "chain",
    "complete-match-basic.yaml"
)
with open(explorer_path, "r") as explorer_file:
    print(explorer_file.read())
    explorer_file.seek(0)
    explorer = Explorer.from_file(explorer_file)

characteristics:
- &#001 !characteristic.chain.Chain
    characteristic: !characteristic.core.Key
        name: "sequence"
descriptions:
- !description.chain.Complete
    - *id001
strategies:
- !strategy.chain.match.basic.Complete
    - *id001
lattice = ConceptLattice.create(
    population=population,
    descriptions=explorer.descriptions,
    strategies=explorer.strategies
)
```





```
HasseDiagram(
    lattice,
    domain_renderer=ConceptRenderer()
)
```



```
BinaryTable(
    lattice.reduced_context,
    domain_renderer=ConceptRenderer(join_irreducible=True),
    co_domain_renderer=ConceptRenderer(meet_irreducible=True)
)
```

	@0	@1	@2	@3	@4	@5	@6	@7	@8	@9
['Visitor_4', 'Vis- itor_6']		✓	✓	✓	✓			✓		✓
Visitor_3	✓	✓	✓	✓	✓	✓	✓			✓
Visitor_14		✓	✓	✓	✓			✓	✓	
Visitor_15	✓		✓	✓	✓				✓	
['Visitor_5', 'Vis- itor_14']			✓						✓	
['Visitor_0', 'Vis- itor_3']	✓	✓			✓	✓	✓			✓
['Visitor_2', 'Vis- itor_3']	✓		✓			✓				
['Visitor_3', 'Vis- itor_6']		✓	✓	✓	✓	✓	✓			✓
['Visitor_1', 'Vis- itor_3', 'Vis- itor_4', 'Vis- itor_6', 'Vis- itor_7', 'Vis- itor_14', ...]			✓	✓						



```
ConceptTable(  
    lattice,  
    concept_width=5,  
    individual_width=10,  
    predicate_width=40  
)
```



Concept	Individuals	Predicates
0		sequence match {}
1		sequence match ('M00',)
2		sequence match ('M04',)
3		sequence match ('M05',)
4		sequence match ('M20',)
5	Visitor_7	sequence match ('M00', 'M04')
6		sequence match ('M04', 'M05')
7		sequence match ('M05', 'M12', 'M20')
8		sequence match ('M00', 'M04', 'M20')
9		sequence match ('M00', 'M04', 'M05', 'M12', 'M20')
10		sequence match ('M05', 'M12', 'M20', 'M23')
11		sequence match ('M99',)
12		sequence match ('M15',)
13	Visitor_1	sequence match ('M00', 'M04', 'M05', 'M12', 'M20', 'M23')
14		sequence match ('M00', 'M99')
15		sequence match ('M00', 'M15')
16		sequence match ('M04', 'M11')
17		sequence match ('M20', 'M99')
18		sequence match ('M00', 'M04', 'M05', 'M12', 'M20', 'M22')

```
19         sequence match ('M05', 'M07', 'M09', 'M12',
20                           'M15', 'M20', 'M23')

21     Visitor_5     sequence match ('M04', 'M05', 'M11')

22         sequence match ('M00', 'M03', 'M04', 'M17',
23                           'M20', 'M99')

24         sequence match ('M00', 'M04', 'M10', 'M11',
25                           'M20')

26         sequence match ('M00', 'M04', 'M05', 'M07',
27                           'M09', 'M12', 'M15', 'M17', 'M19', 'M20',
28                           'M23')

29     Visitor_4     sequence match ('M00', 'M04', 'M05', 'M09',
30                           'M12', 'M20', 'M22', 'M23')

31     Visitor_2     sequence match ('M00', 'M15', 'M99')

32     Visitor_0     sequence match ('M05', 'M07', 'M09', 'M12',
33                           'M15', 'M20', 'M23', 'M99')

34     Visitor_14    sequence match ('M00', 'M04', 'M05', 'M06',
35                           'M10', 'M11', 'M12', 'M19', 'M20', 'M22')

36     Visitor_3     sequence match ('M00', 'M03', 'M04', 'M05',
37                           'M07', 'M08', 'M09', 'M12', 'M15', 'M17',
38                           'M19', 'M20', 'M23', 'M99')

39     Visitor_15    sequence match ('M00', 'M03', 'M04', 'M10',
40                           'M11', 'M17', 'M20', 'M99')

41     Visitor_6     sequence match ('M00', 'M04', 'M05', 'M06',
42                           'M07', 'M09', 'M12', 'M14', 'M15', 'M17',
43                           'M19', 'M20', 'M22', 'M23')

44         sequence match {}
```

---

### 3.2.1.3 Prefix Match Strategy

```


explorer_path = os.path.join(
    share_path,
    "sequence",
    "data",
    "explorers",
    "chain",
    "prefix-match-basic.yaml"
)
with open(explorer_path, "r") as explorer_file:
    print(explorer_file.read())
    explorer_file.seek(0)
    explorer = Explorer.from_file(explorer_file)


```

### characteristics:

- &id001 !characteristic.chain.Chain
   
characteristic: !characteristic.core.Key
   
name: "sequence"

### descriptions:

- !description.chain.Prefix
   
- \*id001

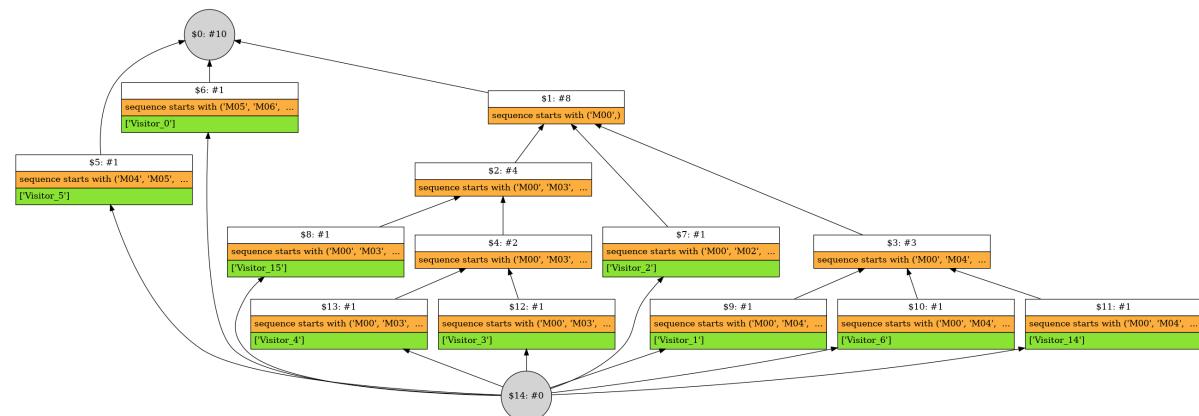
### strategies:

- !strategy.chain.match.basic.Prefix
   
arguments:
   
- \*id001

```


lattice = ConceptLattice.create(
    population=population,
    descriptions=explorer.descriptions,
    strategies=explorer.strategies
)
HasseDiagram(
    lattice,
    domain_renderer=ConceptRenderer()
)


```





```
BinaryTable(
    lattice.reduced_context,
    domain_renderer=ConceptRenderer(join_irreducible=True),
    co_domain_renderer=ConceptRenderer(meet_irreducible=True)
)
```



	@0	@1	@2	@3	@4	@5	@6	@7	@8	@9	@10	@11	@12
Visitor_0					✓								
Visitor_5	✓												
Visitor_2		✓									✓		
Visitor_15		✓							✓			✓	
Visitor_14		✓						✓				✓	
Visitor_6		✓					✓					✓	
Visitor_1		✓				✓						✓	
Visitor_4		✓			✓						✓		✓
Visitor_3		✓		✓							✓		✓



```
ConceptTable(
    lattice,
    concept_width=5,
    individual_width=10,
    predicate_width=40
)
```



Concept	Individuals	Predicates
0		sequence starts with {}
1		sequence starts with ('M00',)
2	Visitor_7	sequence starts with ('M00', 'M03', 'M04')
3		sequence starts with ('M00', 'M04', 'M05', 'M06')
4		sequence starts with ('M00', 'M03', 'M04', 'M05')
5	Visitor_5	sequence starts with ('M04', 'M05', 'M11')

```

6     Visitor_0      sequence starts with ('M05', 'M06', 'M07',
                      'M09', 'M12', 'M14', 'M15', 'M20', 'M23',
                      'M99')

7     Visitor_2      sequence starts with ('M00', 'M02', 'M15',
                      'M99')

8     Visitor_15     sequence starts with ('M00', 'M03', 'M04',
                      'M10', 'M11', 'M17', 'M20', 'M99')

9     Visitor_1      sequence starts with ('M00', 'M04', 'M05',
                      'M06', 'M12', 'M14', 'M20', 'M23')

10    Visitor_6      sequence starts with ('M00', 'M04', 'M05',
                      'M06', 'M07', 'M09', 'M12', 'M14', 'M15',
                      'M17', 'M19', 'M20', 'M22', 'M23')

11    Visitor_14     sequence starts with ('M00', 'M04', 'M05',
                      'M06', 'M10', 'M11', 'M12', 'M19', 'M20',
                      'M22')

12    Visitor_3      sequence starts with ('M00', 'M03', 'M04',
                      'M05', 'M07', 'M08', 'M09', 'M12', 'M15',
                      'M17', 'M19', 'M20', 'M23', 'M99')

13    Visitor_4      sequence starts with ('M00', 'M03', 'M04',
                      'M05', 'M09', 'M10', 'M12', 'M20', 'M22',
                      'M23')

14                  sequence starts with {}

```

### 3.2.1.4 Wine-City with 1000 trajectories



```

import sys
import os
data_path = os.path.join(
    share_path,
    "sequence",
    "data",
    "Wine-City",
    "chain",
    "chain-wine-city-1000.yml"
)
with open(data_path, "r") as data_file:
    population = Population.from_file(data_file)
population
len(population)

```

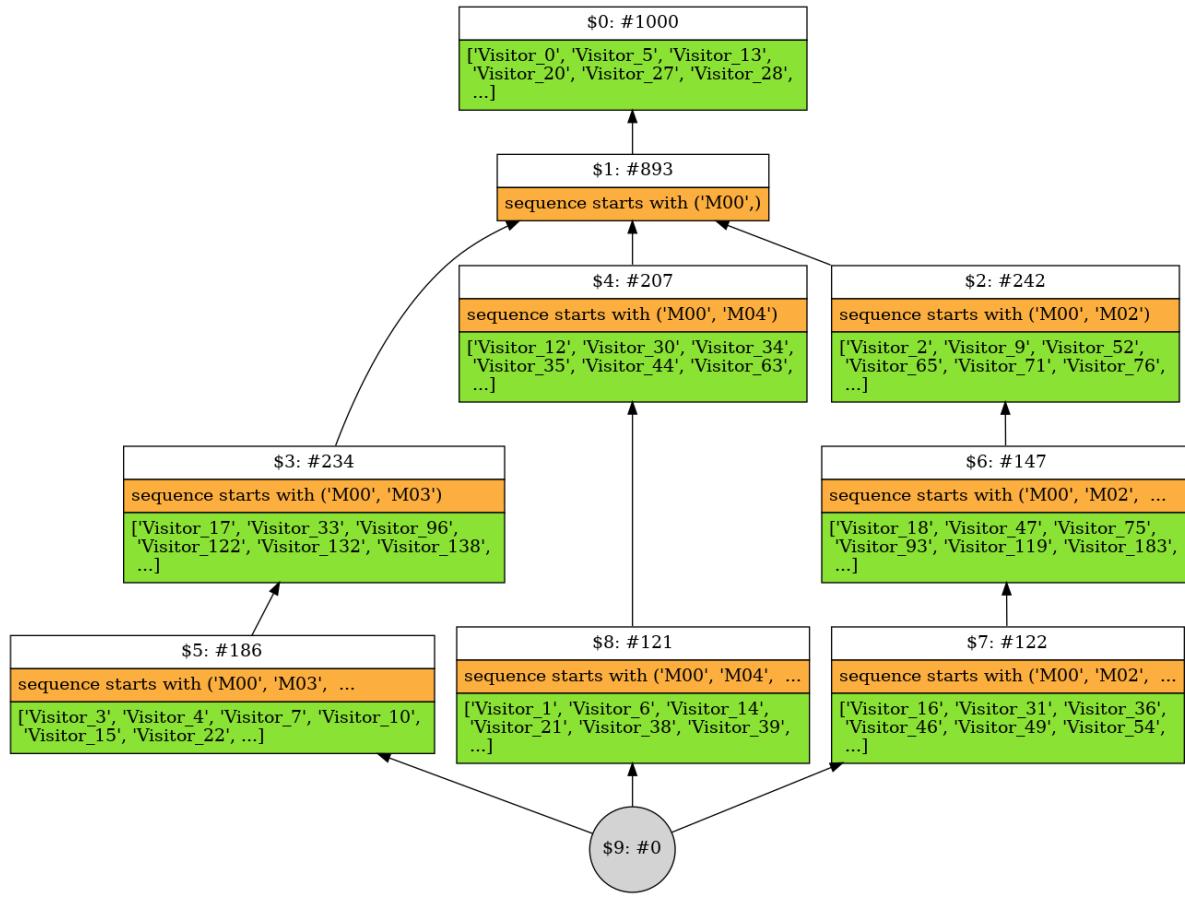


1000

```
from galactic_description_chain_match import (
    PrefixDescription
)

characteristics = [
    Chain(characteristic=Key(name="sequence")))
]
descriptions = [
    PrefixDescription(characteristics[0])
]
strategies = [
    LimitFilter(
        PrefixMatchStrategy(characteristics[0]),
        measure=Cardinality(),
        limit=100
    )
]
lattice = ConceptLattice.create(
    population=population,
    descriptions=descriptions,
    strategies=strategies,
)
HasseDiagram(
    lattice,
    domain_renderer=ConceptRenderer()
)
```





### 3.3 Sequence data

#### 3.3.1 Daily-Actions data set

The Daily-Actions dataset is a small database of sequences that represents daily actions of 25 individuals of L3i laboratory<sup>1</sup>, where a daily action can be [*Wakeup*, *Breakfast*, *Work*, *Dinner..*].

We can use the `Population.from_file` function to load a population in memory and the `Explorer.from_file` function to load a set of strategies described in a `yaml` file.

We can construct a concept lattice from a population and a list of strategies using the `Lattice` class.

The Hasse diagram of a lattice can be visualized using the `HasseDiagram` class, the reduced context can be displayed using the `ReducedContext` class and the summary table can be displayed using the `Table` class.

1: <https://l3i.univ-larochelle.fr/>



```
from galactic.population import Population
from galactic.strategies import Explorer
from galactic.concepts import (
    ConceptLattice,
    ConceptRenderer,
    ConceptTable
)
from galactic.algebras.poset import HasseDiagram
from galactic.algebras.relational import BinaryTable
from project_data import share_path
```



```
import sys
import os

data_path = os.path.join(
    share_path,
    "sequence",
    "data",
    "Daily-Actions",
    "sequence-daily-actions-25.yaml"
)
with open(data_path, "r") as data_file:
    population = Population.from_file(data_file)
population
len(population)
```



25

### 3.3.2 Simple Match Basic



```
explorer_path = os.path.join(
    share_path,
    "sequence",
    "data",
    "explorers",
    "sequence",
    "simple-match-basic.yaml"
)
with open(explorer_path, "r") as explorer_file:
    print(explorer_file.read())
    explorer_file.seek(0)
    explorer = Explorer.from_file(explorer_file)
```

characteristics:

- &id001 !characteristic.sequence.Sequence  
characteristic: !characteristic.core.Key  
name: "sequence"

descriptions:

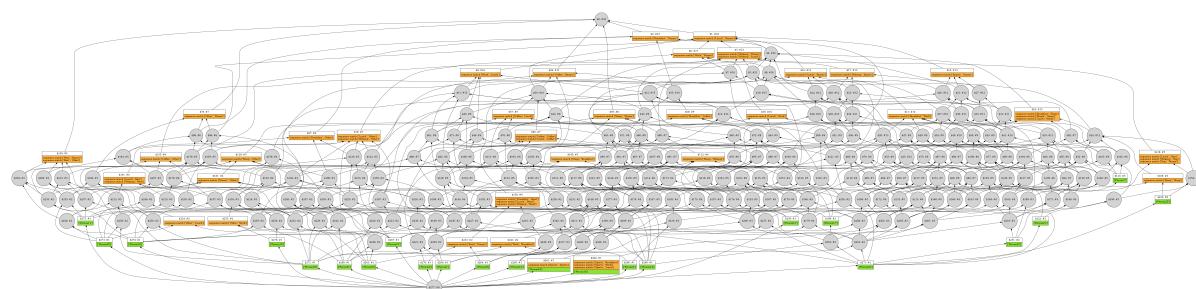
- !description.sequence.Simple
  - \*id001

strategies:

- !strategy.sequence.match.basic.Simple
  - \*id001

```
lattice = ConceptLattice.create(  
    population=population,  
    descriptions=explorer.descriptions,  
    strategies=explorer.strategies  
)
```

```
HasseDiagram(  
    lattice,  
    domain_renderer=ConceptRenderer()  
)
```



### 3.3.3 Distance Match Basic

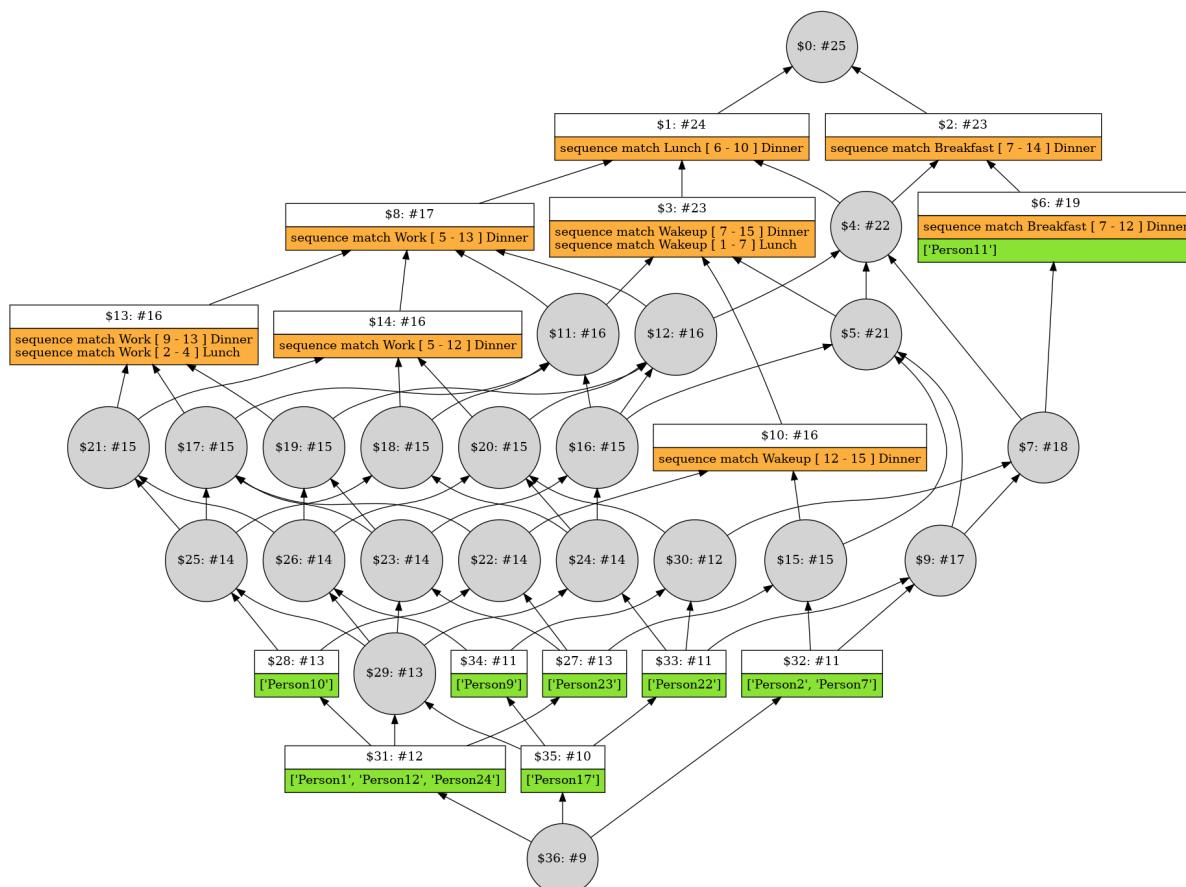
```
from galactic_strategy_sequence_distance_basic import  
    DistanceMatchStrategy  
from galactic_description_sequence_distance import DistanceDescription  
from galactic.strategies import LimitFilter  
from galactic.strategies import Cardinality  
from galactic_characteristic_sequence import Sequence  
from galactic.characteristics import Key  
  
characteristics = [  
    Sequence(characteristic=Key(name="sequence"))]  
]  
descriptions = [  
    DistanceDescription(characteristics[0])]  
]  
strategies = [  
    LimitFilter(
```

```

        DistanceMatchStrategy(characteristics[0]),
        measure= Cardinality(),
        limit=15
    )
]

lattice = ConceptLattice.create(
    population=population,
    descriptions=descriptions,
    strategies=strategies,
)
HasseDiagram(
    lattice,
    domain_renderer=ConceptRenderer(width=80)
)

```



```

BinaryTable(
    lattice.reduced_context,
    domain_renderer=ConceptRenderer(join_irreducible=True),
    co_domain_renderer=ConceptRenderer(meet_irreducible=True)
)

```

	@0	@1	@2	@3	@4	@5	@6	@7	@8	@9
[‘Person1’, ‘Per- son3’, ‘Per- son5’, ‘Per- son6’, ‘Per- son8’, ‘Per- son10’, ...]		✓			✓	✓		✓		✓
[‘Person1’, ‘Per- son3’, ‘Per- son5’, ‘Per- son6’, ‘Per- son8’, ‘Per- son9’, ...]		✓	✓		✓	✓		✓		
[‘Person1’, ‘Per- son3’, ‘Per- son5’, ‘Per- son6’, ‘Per- son8’, ‘Per- son12’, ...]		✓	✓		✓	✓	✓	✓	✓	✓

[‘Person3’, ✓ ✓ ✓ ✓ ✓ ✓ ✓ ✓ ✓]
[‘Person2’, ✓ ✓ ✓ ✓ ✓ ✓ ✓ ✓ ✓]
[‘Person1’, ✓ ✓ ✓ ✓ ✓ ✓ ✓ ✓ ✓]

[‘Person3’, ✓ ✓ ✓ ✓ ✓ ✓ ✓ ✓]

‘Per-  
son5’,  
‘Per-  
son6’,  
‘Per-  
son8’,  
‘Per-  
son9’,  
‘Per-  
son14’,  
...]

[‘Person2’, ✓ ✓ ✓ ✓ ✓ ✓ ✓ ✓]

‘Per-  
son3’,  
‘Per-  
son4’,  
‘Per-  
son5’,  
‘Per-  
son6’,  
‘Per-  
son7’,  
...]

[‘Person1’, ✓ ✓ ✓ ✓ ✓ ✓ ✓ ✓ ✓]

‘Per-  
son3’,  
‘Per-  
son5’,  
‘Per-  
son6’,  
‘Per-  
son8’,  
‘Per-  
son10’,  
...]

```
[‘Person1’,    ✓      ✓          ✓          ✓          ✓
 ‘Per-
son3’,
 ‘Per-
son5’,
 ‘Per-
son6’,
 ‘Per-
son8’,
 ‘Per-
son12’,
 ...]
```



ConceptTable(lattice)



Concept	Individuals	Predicates
1		sequence match Lunch [ 6 - 10 ] Dinner
2		sequence match Breakfast [ 7 - 14 ] Dinner
3	Person15	sequence match Wakeup [ 7 - 15 ] Dinnersequence match Wakeup [ 1 - 7 ] Lunch
4		sequence match Breakfast [ 8 - 14 ] Dinnersequence match Breakfast [ 2 - 5 ] Lunch
5		sequence match Wakeup [ 1 - 3 ] Breakfastsequence match Wakeup [ 9 - 15 ] Dinnersequence match Wakeup [ 3 - 7 ] Lunch

6	Person11	sequence match Breakfast [ 7 - 12 ] Dinner
7		sequence match Breakfast [ 8 - 12 ] Dinnersequence match Lunch [ 6 - 8 ] Dinner
8		sequence match Work [ 5 - 13 ] Dinner
9	['Person4', 'Person13', 'Person20', 'Person25']	sequence match Wakeup [ 9 - 13 ] Dinner
10		sequence match Wakeup [ 12 - 15 ] Dinnersequence match Wakeup [ 4 - 7 ] Lunch
11		sequence match Wakeup [ 11 - 15 ] Dinnersequence match Wakeup [ 1 - 6 ] Worksequence match Wakeup [ 4 - 7 ] Lunch
12		sequence match Breakfast [ 10 - 14 ] Dinner
13		sequence match Work [ 9 - 13 ] Dinnersequence match Work [ 2 - 4 ] Lunch

```
14          sequence match Work [  
5 - 12 ]  
Dinnersequence match  
Lunch [ 6 - 9 ]  
Dinner  
  
15          sequence match  
Breakfast [ 10 - 14 ]  
Dinner  
  
17          sequence match Wakeup  
[ 1 - 3 ] Work  
  
18          sequence match Wakeup  
[ 11 - 14 ] Dinner  
  
20          sequence match  
Breakfast [ 10 - 13 ]  
Dinner  
  
21          sequence match Work [  
9 - 12 ] Dinner  
  
22          sequence match Work [  
10 - 13 ]  
Dinnersequence match  
Work [ 3 - 4 ] Lunch  
  
27          Person23          sequence match Wakeup  
[ 5 - 7 ] Lunch  
  
28          Person10          sequence match Work [  
10 - 12 ]  
Dinnersequence match  
Wakeup [ 12 - 14 ]  
Dinner  
  
30          sequence match  
Breakfast [ 10 - 12 ]  
Dinner  
  
31          ['Person1',  
'Person12',  
'Person24']
```

32	<code>['Person2', 'Person7']</code>	sequence match Breakfast [ 10 - 12 ] Dinner sequence match Wakeup [ 12 - 13 ] Dinner
33	<code>Person22</code>	sequence match Wakeup [ 11 - 13 ] Dinner
34	<code>Person9</code>	
35	<code>Person17</code>	
36	<code>['Person3', 'Person5', 'Person6', 'Person8', 'Person14', 'Person16', ...]</code>	

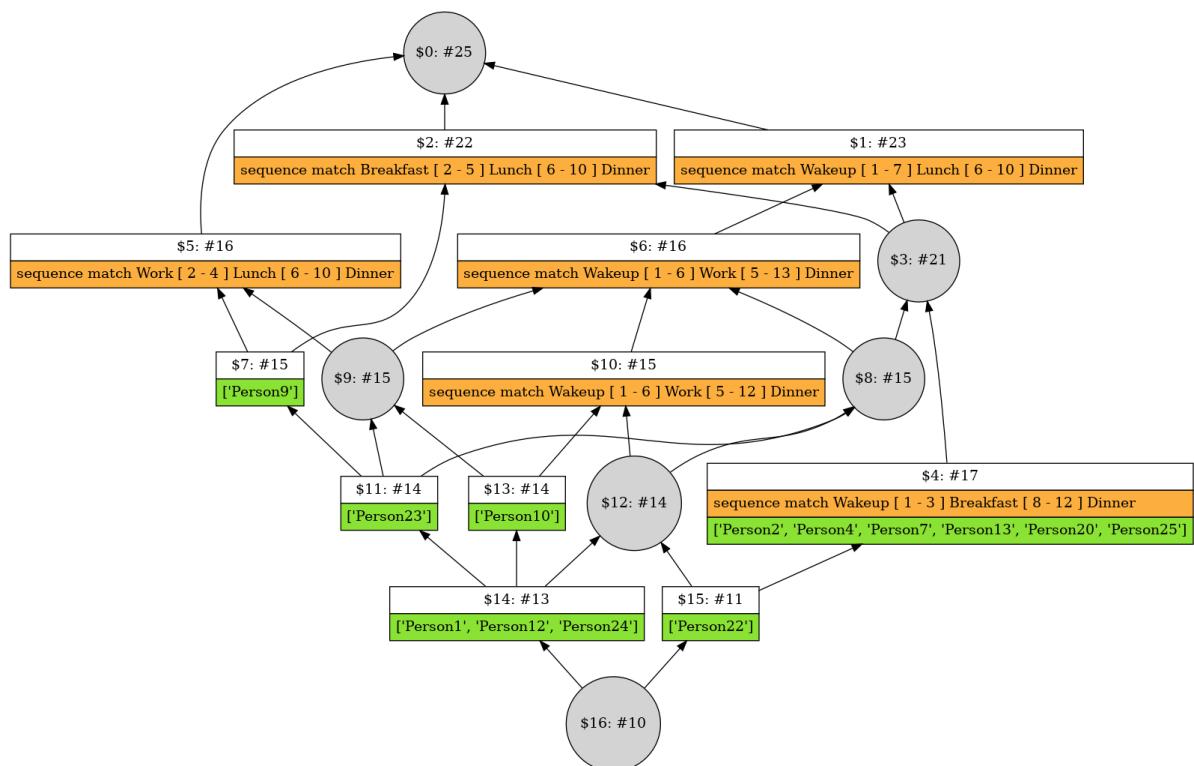
### 3.3.4 Distance: Length = 3



```
characteristics = [  
    Sequence(characteristic=Key(name="sequence"))  
]  
descriptions = [  
    DistanceDescription(  
        characteristics[0],  
        length=3  
    )  
]  
strategies = [  
    LimitFilter(  
        DistanceMatchStrategy(  
            characteristics[0],  
            length=3  
        ),  
        measure=Cardinality(),  
        limit=15  
    )  
]  
  
lattice = ConceptLattice.create(  
    population=population,  
    descriptions=descriptions,  
    strategies=strategies,  
)
```



```
HasseDiagram(
    lattice,
    domain_renderer=ConceptRenderer(width=80)
)
```



```
ConceptTable(lattice)
```



Concept	Individuals	Predicates
0	Person11	
1	Person15	sequence match Wakeup [ 1 - 7 ] Lunch [ 6 - 10 ] Dinner
2		sequence match Breakfast [ 2 - 5 ] Lunch [ 6 - 10 ] Dinner

```
3                                sequence match Wakeup  
                                [ 1 - 3 ] Breakfast [  
                                8 - 14 ]  
                                Dinnersequence match  
                                Wakeup [ 1 - 3 ]  
                                Breakfast [ 2 - 5 ]  
                                Lunchsequence match  
                                Wakeup [ 3 - 7 ]  
                                Lunch [ 6 - 10 ]  
                                Dinner  
  
4      ['Person2',           sequence match  
      'Person4', 'Person7', Breakfast [ 2 - 5 ]  
      'Person13',          Lunch [ 6 - 8 ]  
      'Person20',           Dinnersequence match  
      'Person25']          Wakeup [ 1 - 3 ]  
                           Breakfast [ 8 - 12 ]  
                           Dinnersequence match  
                           Wakeup [ 3 - 7 ]  
                           Lunch [ 6 - 8 ]  
                           Dinner  
  
5                                sequence match Work [  
                                2 - 4 ] Lunch [ 6 -  
                                10 ] Dinner  
  
6                                sequence match Wakeup  
                                [ 1 - 6 ] Work [ 5 -  
                                13 ] Dinnersequence  
                                match Wakeup [ 4 - 7  
                                ] Lunch [ 6 - 10 ]  
                                Dinner  
  
7      Person9  
  
8                                sequence match Wakeup  
                                [ 1 - 3 ] Breakfast [  
                                10 - 14 ] Dinner
```

```
9          sequence match Wakeup
[ 1 - 3 ] Work [ 9 -
13 ] Dinnersequence
match Wakeup [ 1 - 3
] Work [ 2 - 4 ]
Lunch

10         sequence match Wakeup
[ 1 - 6 ] Work [ 5 -
12 ] Dinnersequence
match Wakeup [ 4 - 7
] Lunch [ 6 - 9 ]
Dinner

11         Person23

12         sequence match
Breakfast [ 2 - 5 ]
Lunch [ 6 - 9 ]
Dinnersequence match
Wakeup [ 1 - 3 ]
Breakfast [ 10 - 13 ]
Dinner

13         Person10
sequence match Work [
2 - 4 ] Lunch [ 6 - 9
] Dinnersequence
match Wakeup [ 1 - 3
] Work [ 9 - 12 ]
Dinner

14         ['Person1',
'Person12',
'Person24']

15         Person22
sequence match Wakeup
[ 1 - 3 ] Breakfast [
10 - 12 ]
Dinnersequence match
Wakeup [ 4 - 7 ]
Lunch [ 6 - 8 ]
Dinner
```

```
16      ['Person3',           sequence match Work [
          'Person5', 'Person6', 2 - 4 ] Lunch [ 6 - 8
          'Person8',           ] Dinner
          'Person14',
          'Person16', ...]
```

---

## 3.4 Interval data

### 3.4.1 Wine-City data set

The Wine-City dataset is issued from the museum data “La cité du vin” in Bordeaux, France (<https://www.laciteduvin.com/en>), gathered from the visits on a period of one year (May 2016 to May 2017). The museum is a large “open-space”, where visitors are free to explore the museum the way they want, without predetermined path. When they arrive at the museum, they receive a small personal device to detect whenever a visitor is close to an animation spot called a *module*. The museum contains 20 modules, so we can say that extracted sequences for this data is quite short. By extracting the sequences of activation of each module, we end up with a precise enough idea of what the visit looked like for each visitor of the museum.

The lattice construction from the Wine-City data set could lead to very big lattice (several hundred thousand concepts) and takes a lot of time to process. Here we select random portion from the dataset to test our strategies, also we may use the meta strategies to limit the generation of concepts according to the support or confidence.

We can use the `Population.from_file` function to load a population in memory and the `Explorer.from_file` function to load a set of strategies described in a `yaml` file.

We can construct a concept lattice from a population and a list of strategies using the `Lattice` class.

The Hasse diagram of a lattice can be visualized using the `HasseDiagram` class, the reduced context can be displayed using the `ReducedContext` class and the summary table can be displayed using the `Table` class.



```
from galactic.population import Population
from galactic.strategies import Explorer
from galactic.concepts import (
    ConceptLattice,
    ConceptRenderer,
    ConceptTable
)
from galactic.algebras.poset import HasseDiagram
from galactic.algebras.relational import BinaryTable
from project_data import share_path
```



```
import sys
import os

data_path = os.path.join(
    share_path,
    "sequence",
    "data",
    "Wine-City",
    "interval",
    "interval-wine-city-20.yml"
)
with open(data_path, "r") as data_file:
    population = Population.from_file(data_file)
population
len(population)
```



20



### 3.4.1.1 Simple Match Strategy

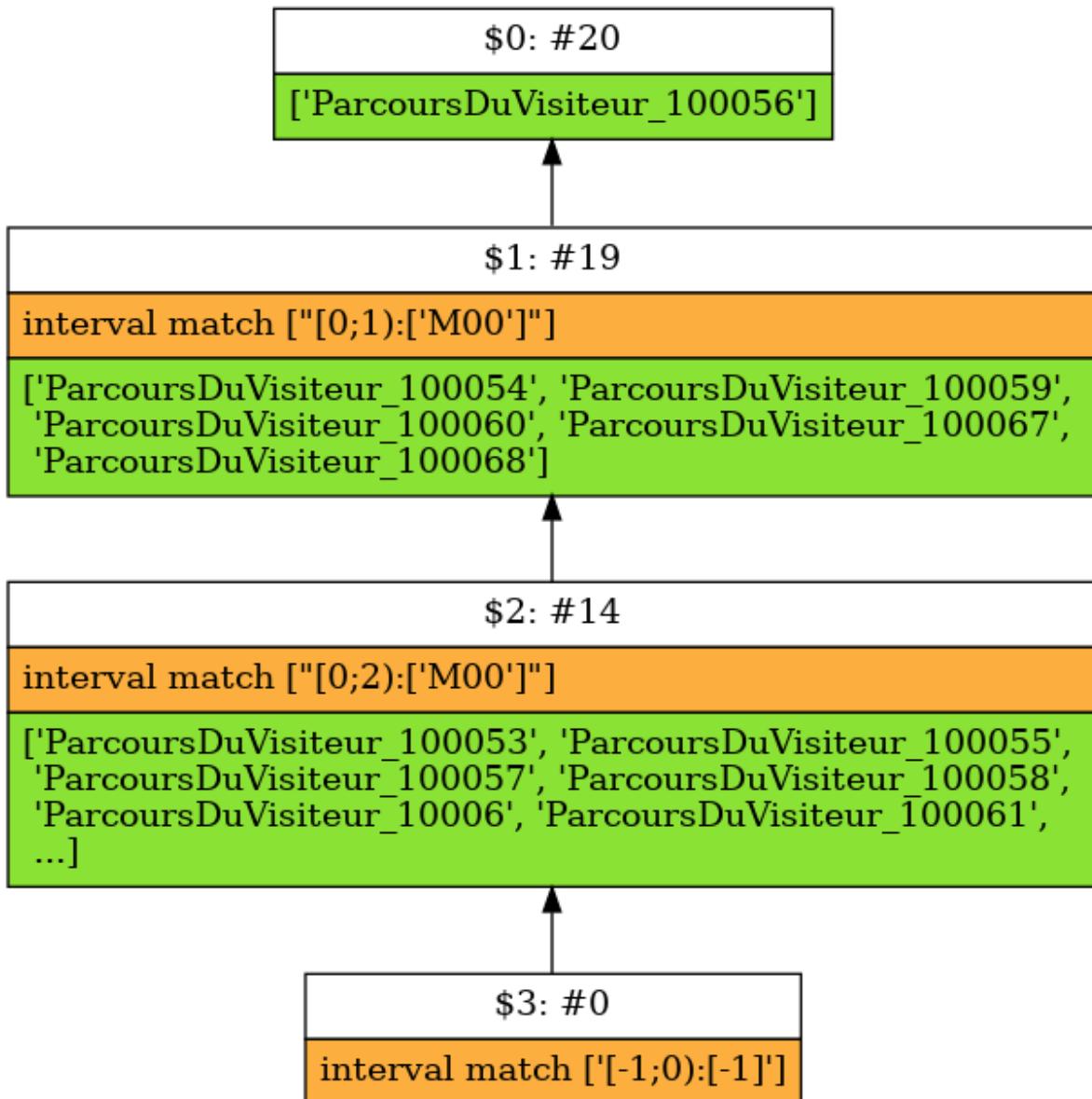
```
explorer_path = os.path.join(
    share_path,
    "sequence",
    "data",
    "explorers",
    "interval-sequence",
    "atf-match-basic.yaml"
)
with open(explorer_path, "r") as explorer_file:
    print(explorer_file.read())
    explorer_file.seek(0)
    explorer = Explorer.from_file(explorer_file)

characteristics:
- &#001 !characteristic.interval.Interval
    characteristic: !characteristic.core.Key
        name: "interval"
descriptions:
- !description.interval.MaximalCommonInterval
    - *id001
strategies:
- !strategy.interval.intersection.basic.AlphabetTimeFrame
arguments:
- *id001
```



```
lattice = ConceptLattice.create(  
    population=population,  
    descriptions=explorer.descriptions,  
    strategies=explorer.strategies  
)
```

```
HasseDiagram(  
    lattice,  
    domain_renderer=ConceptRenderer()  
)
```



```
BinaryTable(  
    lattice.reduced_context,  
    domain_renderer=ConceptRenderer(join_irreducible=True),  
    co_domain_renderer=ConceptRenderer(meet_irreducible=True)  
)
```



@0

@1

@2

[‘ParcoursDuVisiteur_100053’, ‘ParcoursDuVis- iteur_100055’, ‘ParcoursDuVis- iteur_100057’, ‘ParcoursDuVis- iteur_100058’, ‘ParcoursDuVis- iteur_10006’, ‘ParcoursDuVis- iteur_100061’, ...]	✓	✓
[‘ParcoursDuVisiteur_100053’, ‘ParcoursDuVis- iteur_100054’, ‘ParcoursDuVis- iteur_100055’, ‘ParcoursDuVis- iteur_100057’, ‘ParcoursDuVis- iteur_100058’, ‘ParcoursDuVis- iteur_100059’, ...]	✓	
[‘ParcoursDuVisiteur_100053’, ‘ParcoursDuVis- iteur_100054’, ‘ParcoursDuVis- iteur_100055’, ‘ParcoursDuVis- iteur_100056’, ‘ParcoursDuVis- iteur_100057’, ‘ParcoursDuVis- iteur_100058’, ...]		



ConceptTable(lattice)

Concept	Individuals	Predicates
0	ParcoursDuVisiteur_100056	interval match ['[-1;0):[-1]']
1		['ParcoursDuVisiteur_100054', 'ParcoursDuVisiteur_100059', 'ParcoursDuVisiteur_100060', 'ParcoursDuVisiteur_100067', 'ParcoursDuVisiteur_100068']
2		['ParcoursDuVisiteur_100053', 'ParcoursDuVisiteur_100055', 'ParcoursDuVisiteur_100057', 'ParcoursDuVisiteur_100058', 'ParcoursDuVisiteur_10006', 'ParcoursDuVisiteur_100061', ...]

### 3.4.2 GeoLuciole data set

Is issued from classical GPS trajectories of people's displacements in the city of La Rochelle in France. By matching the GPS coordinates to districts of the city, raw data are transformed into semantic sequences. The data have been collected by a specific application named GeoLuciole that we have developed for the DA3T1. project. The data contains only 15 trajectories with an average size of sequences equals to 2 2.

1: System for the Analysis of Numerical Traces for the development of Tourist Territories (Dispositif d'Analyse des Traces numériques pour la valorisation des Territoires Touristiques)

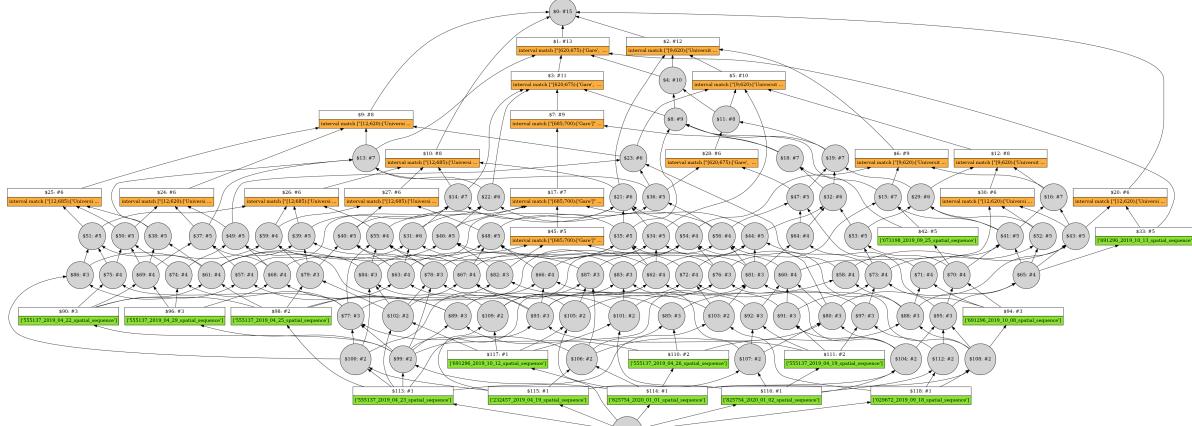
2 : It was planned to collect more data during the holidays on Mars and April, but unfortunately, this was impossible due to the world pandemic Covid-19

```
data_path = os.path.join(  
    share_path,  
    "sequence",  
    "data",  
    "GeoLuciole",  
    "interval-geoluciole-15.yml"  
)  
with open(data_path, "r") as data_file:  
    population = Population.from_file(data_file)  
population  
len(population)
```

15

```
from galactic_strategy_interval_sequence_basic import (
    AugmentedMinimumCardinalityStrategy,
    AlphabetTimeFrameStrategy,
    BoundsTimeFrameStrategy,
    SimpleTimeFrameStrategy,
    WindowAffixTimeFrameStrategy
)
from galactic_description_interval_sequence import (
    SharedIntervalDescription
)
from galactic.strategies import LimitFilter
from galactic_characteristic_interval import Interval
from galactic.characteristics import Key
from galactic.strategies import Cardinality

characteristics = [
    Interval(characteristic=Key(name="interval"))
]
descriptions = [
    SharedIntervalDescription(characteristics[0])
]
strategies = [
    LimitFilter(
        BoundsTimeFrameStrategy(characteristics[0]),
        measure=Cardinality(),
        limit=5
    )
]
lattice = ConceptLattice.create(
    population=population,
    descriptions=descriptions,
    strategies=strategies
)
HasseDiagram(
    lattice,
    domain_renderer=ConceptRenderer()
)
```



```

BinaryTable(
    lattice.reduced_context,
    domain_renderer=ConceptRenderer(join_irreducible=True),
    co_domain_renderer=ConceptRenderer(meet_irreducible=True)
)

```

@0 @1 @2 @3 @4 @5 @6 @7 @8 @9 @10@11@12@13@14@15@16@17@18@19@20@21@22

555137_2019_04_23_spatial_sequence	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓
825754_2020_01_01_spatial_sequence	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓
232457_2019_04_19_spatial_sequence	✓		✓	✓	✓	✓		✓		✓	✓
825754_2020_01_02_spatial_sequence	✓	✓			✓	✓	✓	✓	✓	✓	✓
691296_2019_10_12_spatial_sequence					✓	✓	✓		✓		✓
029672_2019_09_18_spatial_sequence	✓	✓	✓				✓	✓	✓	✓	✓
[‘555137_2019_...tial_sequence’, ‘825754_2020_...tial_sequence’]	✓	✓	✓	✓			✓	✓	✓	✓	✓
[‘029672_2019_...tial_sequence’, ‘691296_2019_...tial_sequence’, ‘825754_2020_...tial_sequence’]	✓		✓				✓	✓	✓	✓	✓
[‘029672_2019_...tial_sequence’, ‘825754_2020_...tial_sequence’, ‘825754_2020_...tial_sequence’]	✓		✓				✓	✓	✓	✓	✓
[‘555137_2019_...tial_sequence’, ‘825754_2020_...tial_sequence’]	✓	✓	✓	✓			✓	✓	✓	✓	✓

['555137_2019_...tial_sequence', '555137_2019_...tial_sequence', '825754_2020_...tial_sequence']	✓ ✓ ✓ ✓ ✓ ✓ ✓
['555137_2019_...tial_sequence', '555137_2019_...tial_sequence', '825754_2020_...tial_sequence']	✓ ✓ ✓ ✓ ✓ ✓ ✓
['555137_2019_...tial_sequence', '555137_2019_...tial_sequence', '825754_2020_...tial_sequence']	✓ ✓ ✓ ✓ ✓ ✓ ✓
['555137_2019_...tial_sequence', '555137_2019_...tial_sequence', '825754_2020_...tial_sequence']	✓ ✓ ✓ ✓ ✓ ✓ ✓
['029672_2019_...tial_sequence', '555137_2019_...tial_sequence', '825754_2020_...tial_sequence']	✓ ✓ ✓ ✓ ✓ ✓ ✓
['029672_2019_...tial_sequence', '073198_2019_...tial_sequence', '691296_2019_...tial_sequence', '825754_2020_...tial_sequence', '825754_2020_...tial_sequence']	✓ ✓ ✓ ✓ ✓ ✓
['029672_2019_...tial_sequence', '555137_2019_...tial_sequence', '825754_2020_...tial_sequence', '825754_2020_...tial_sequence']	✓ ✓ ✓ ✓ ✓ ✓
['029672_2019_...tial_sequence', '555137_2019_...tial_sequence', '691296_2019_...tial_sequence', '825754_2020_...tial_sequence', '825754_2020_...tial_sequence']	✓ ✓ ✓ ✓ ✓ ✓



```
ConceptTable(  
    lattice,  
    concept_width=5,  
    individual_width=20,  
    predicate_width=40  
)
```

 Concept Individuals

## Predicates

0

```
interval match
"[9;620):['Universite']",
"[620;675):['Gare', 'Saint-Nicolas',
'Universite']",
"[675;685):['Notre-Dame_Arsenal',
'Universite']", "[685;700):['Gare',
'Notre-Dame_Arsenal', 'Universite']",
"[700;736):['Notre-Dame_Arsenal',
'Universite']",
"[736;868):['Notre-Dame_Arsenal',
'Port_de_plaisance', 'Universite']",
"[868;934):['Le_gabut',
'Notre-Dame_Arsenal',
'Port_de_plaisance', 'Saint-Nicolas'],
'Universite']",
"[934;953):['Notre-Dame_Arsenal']"
```

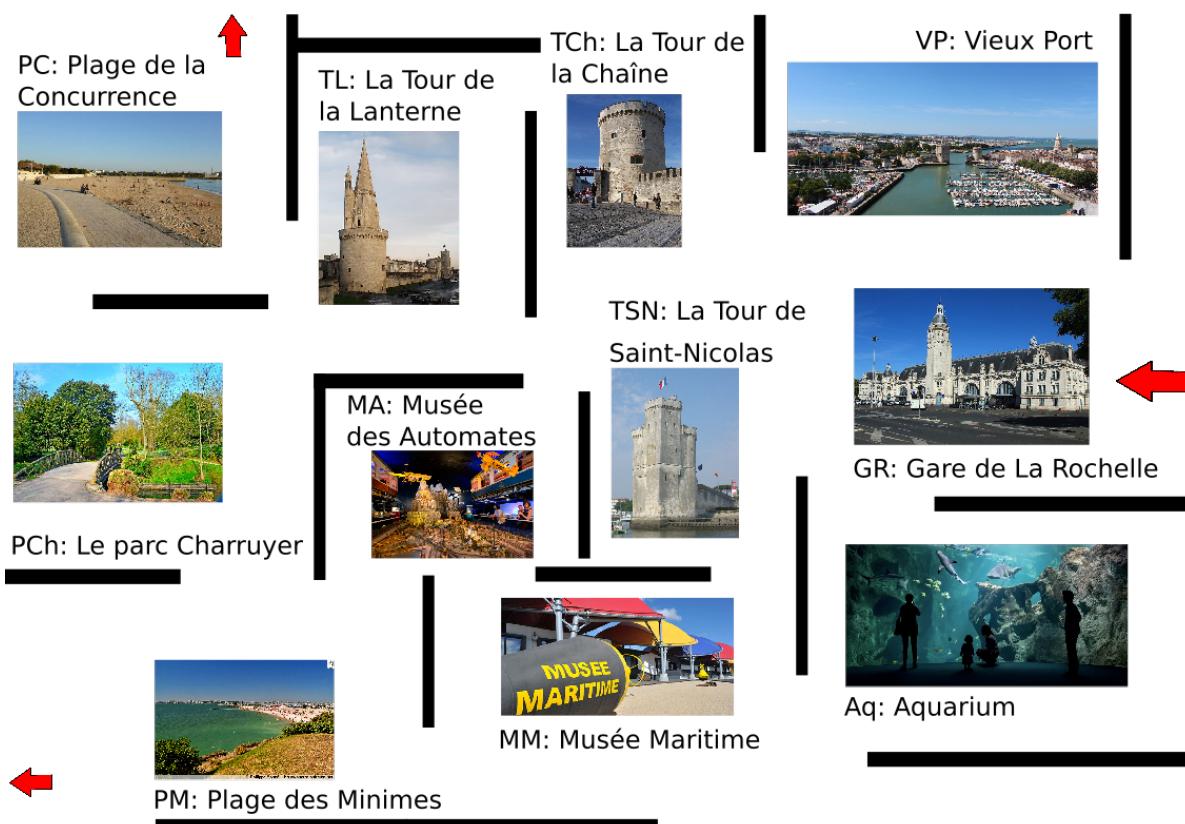
```
16      558026_2019_07_11_spatial_sequence
33      691296_2019_10_13_spatial_sequence
42      073198_2019_09_25_spatial_sequence
90      555137_2019_04_22_spatial_sequence
94      691296_2019_10_08_spatial_sequence
96      555137_2019_04_29_spatial_sequence
98      555137_2019_04_25_spatial_sequence
110     555137_2019_04_26_spatial_sequence
111     555137_2019_04_19_spatial_sequence
113     555137_2019_04_23_spatial_sequence
114     825754_2020_01_01_spatial_sequence
115     232457_2019_04_19_spatial_sequence
116     825754_2020_01_02_spatial_sequence
117     691296_2019_10_12_spatial_sequence
118     029672_2019_09_18_spatial_sequence
```

## 3.5 Science Party data

### 3.5.1 Fête de Science

#### 3.5.1.1 Exemple de Labyrinthe

```
from project_data import share_path
from IPython.display import Image
import sys
import os
data_path = os.path.join(
    share_path,
    "sequence",
    "data",
    "images",
    "labyrinthe-f.png"
)
Image(filename=data_path)
```



```

from galactic.population import Population
from galactic.concepts import (
    ConceptLattice,
    ConceptTable
)
from galactic.concepts import (
    ConceptRenderer,
    ConceptTable
)
from galactic.algebras.poset import HasseDiagram
from galactic_strategy_chain_match_basic import (
    CompleteMatchStrategy,
    PrefixMatchStrategy
)
from galactic_description_chain_match import (
    CompleteDescription,
    PrefixDescription
)
from galactic.strategies import LimitFilter
from galactic_characteristic_chain import Chain
from galactic.characteristics import Key
from galactic.strategies import Cardinality
from galactic.algebras.relational import BinaryTable

```

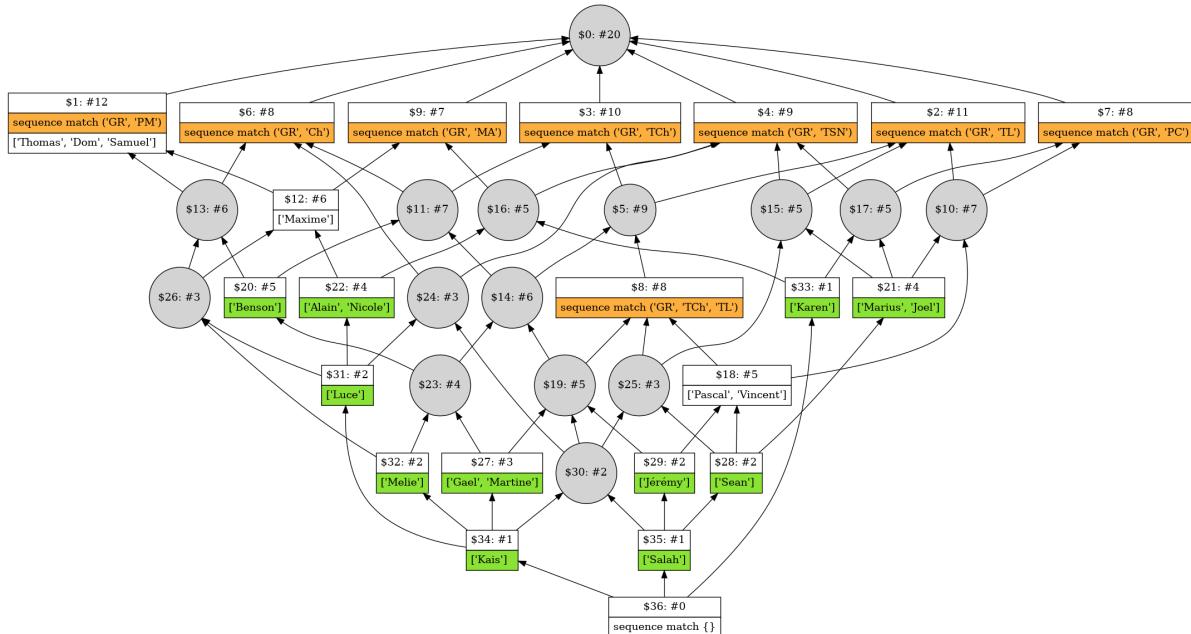
```


# Alphabet: "GR", "TSN", "TCh", "TL", "Ch", "PC", "VP", "MA", "PM", "MM",
↪ "Aq"
data = {
    "Salah" : {"sequence": ["GR", "TSN", "TCh", "TL", "Ch", "PC"]},
    "Jérémie" : {"sequence": ["GR", "VP", "TCh", "TL", "Ch", "PC"]},
    "Thomas" : {"sequence": ["GR", "Aq", "MM", "PM"]},
    "Dom" : {"sequence": ["GR", "Aq", "MM", "PM"]},
    "Kais" : {"sequence": ["GR", "TCh", "TL", "TSN", "MM", "MA", "Ch",
        ↪ "TL", "TSN", "MM", "PM"]},
    "Marius" : {"sequence": ["GR", "TSN", "TL", "PC"]},
    "Joel" : {"sequence": ["GR", "TSN", "TL", "PC"]},
    "Alain" : {"sequence": ["GR", "TSN", "MM", "MA", "PM"]},
    "Sean" : {"sequence": ["GR", "TSN", "TCh", "TL", "PC"]},
    "Samuel" : {"sequence": ["GR", "Aq", "MM", "PM"]},
    "Benson" : {"sequence": ["GR", "TCh", "MM", "Ch", "PM"]},
    "Gael" : {"sequence": ["GR", "VP", "TCh", "TL", "Ch", "PM"]},
    "Martine" : {"sequence": ["GR", "VP", "TCh", "TL", "Ch", "PM"]},
    "Melie" : {"sequence": ["GR", "Aq", "TL", "TCh", "MA", "Ch", "PM"]},
    "Luce" : {"sequence": ["GR", "TSN", "MM", "Aq", "MA", "Ch", "PM"]},
    "Pascal" : {"sequence": ["GR", "VP", "TCh", "TL", "PC"]},
    "Vincent" : {"sequence": ["GR", "VP", "TCh", "TL", "PC"]},
    "Nicole" : {"sequence": ["GR", "Aq", "TSN", "MM", "MA", "PM"]},
    "Karen" : {"sequence": ["GR", "TSN", "MA", "PC"]},
    "Maxime" : {"sequence": ["GR", "MM", "MA", "PM"]},
}
population = Population(data)


characteristics = [
    Chain(characteristic=Key(name="sequence"))
]
descriptions = [
    CompleteDescription(characteristics[0])
]
strategies = [
    CompleteMatchStrategy(characteristics[0])
]
lattice = ConceptLattice.create(
    population=population,
    descriptions=descriptions,
    strategies=strategies
)

HasseDiagram(
    lattice,
    domain_renderer=ConceptRenderer(
        width=80,
        show_individuals=True,
        show_predicates=True
)
)

```



```

BinaryTable(
    lattice.reduced_context,
    domain_renderer=ConceptRenderer(join_irreducible=True),
    co_domain_renderer=ConceptRenderer(meet_irreducible=True)
)

```

	@0	@1	@2	@3	@4	@5	@6	@7	@8
Karen	✓		✓				✓		
Kais	✓	✓	✓	✓	✓	✓		✓	✓
Salah		✓	✓	✓		✓	✓		✓
['Salah', 'Sean']			✓	✓		✓	✓		✓
['Salah', 'Jérémie']		✓		✓		✓	✓		✓
['Kais', 'Gael', 'Mar- tine']		✓		✓	✓	✓			✓
['Kais', 'Luce']	✓	✓	✓		✓				
['Kais', 'Melie']	✓	✓		✓	✓	✓		✓	

['Kais', 'Alain', 'Luce', 'Nicole']	✓	✓	✓	
['Salah', 'Marius', 'Joel', 'Sean']		✓	✓	✓
['Kais', 'Gael', 'Mar- tine', 'Melie']	✓	✓	✓	✓
['Kais', 'Ben- son', 'Gael', 'Mar- tine', 'Melie']	✓		✓	✓



```
ConceptTable(  
    lattice,  
    concept_width=5,  
    individual_width=10,  
    predicate_width=40  
)
```



Concept	Individuals	Predicates
0		sequence match ('GR',)
1	['Thomas', 'Dom', 'Samuel']	sequence match ('GR', 'PM')
2		sequence match ('GR', 'TL')
3		sequence match ('GR', 'TCh')
4		sequence match ('GR', 'TSN')
6		sequence match ('GR', 'Ch')

```
7         sequence match ('GR', 'PC')
8         sequence match ('GR', 'TCh', 'TL')
9         sequence match ('GR', 'MA')
10        sequence match ('GR', 'TL', 'PC')
11        sequence match ('GR', 'TCh', 'Ch')
12        Maxime      sequence match ('GR', 'MA', 'PM')
13                  sequence match ('GR', 'Ch', 'PM')
14                  sequence match ('GR', 'TL', 'Ch')
15                  sequence match ('GR', 'TSN', 'TL')
16                  sequence match ('GR', 'TSN', 'MA')
17                  sequence match ('GR', 'TSN', 'PC')
18        ['Pascal',   sequence match ('GR', 'TCh', 'TL', 'PC')
19         'Vincent']
20
21        Benson      sequence match ('GR', 'TCh', 'Ch', 'PM')
22        ['Marius',   sequence match ('GR', 'TSN', 'TL', 'PC')
23         'Joel']
24
25        ['Alain',    sequence match ('GR', 'TSN', 'MM', 'MA',
26         'Nicole')     'PM')
27
28        sequence match ('GR', 'TL', 'Ch', 'PM')
29        sequence match ('GR', 'TSN', 'Ch')
30
31        sequence match ('GR', 'MA', 'Ch', 'PM')
32
33        ['Gael',     sequence match ('GR', 'TCh', 'TL', 'Ch',
34         'Martine')    'PM')
35
36        Sean        sequence match ('GR', 'TSN', 'TCh', 'TL',
37         'PC')
38
39        Jérémie     sequence match ('GR', 'TCh', 'TL', 'Ch',
40         'PC')
```

```

31      Luce          sequence match ('GR', 'TSN', 'MM', 'MA',
                                'Ch', 'PM')

32      Melie         sequence match ('GR', 'TL', 'MA', 'Ch',
                                'PM')sequence match ('GR', 'TCh', 'MA', 'Ch',
                                'PM')

33      Karen         sequence match ('GR', 'TSN', 'MA', 'PC')

34      Kais          sequence match ('GR', 'TCh', 'TL', 'TSN',
                                'MM', 'MA', 'Ch', 'TL', 'TSN', 'MM', 'PM')

35      Salah         sequence match ('GR', 'TSN', 'TCh', 'TL',
                                'Ch', 'PC')

36
            sequence match {}

```

---

### 3.5.2 Avec limitation de cardinalité



```

characteristics = [
    Chain(characteristic=Key(name="sequence"))
]
descriptions = [
    PrefixDescription(characteristics[0])
]
strategies = [
    LimitFilter(
        PrefixMatchStrategy(characteristics[0]),
        measure=Cardinality(),
        limit=2
    )
]
lattice = ConceptLattice.create(
    population=population,
    descriptions=descriptions,
    strategies=strategies
)
HasseDiagram(
    lattice,
    domain_renderer=ConceptRenderer(
        width=80,
        show_individuals=True,
        show_predicates=True
    )
)

```

