

Hands on Weka: Part III

Classification rules and descriptive induction

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Voting dataset

- 435 instances
- 16 attributes
 - 16 nominal attributes
 - 0 numeric attributes
- No target variable
- No missing values

Weka Explorer

Preprocess | Classify | Cluster | Associate | Select attributes | Visualize

Open fil... | Open U... | Open D... | Undo | Edit... | Save...

Filter: Choose **None** Apply

Current relation: Relation: voting, Instances: 435, Attributes: 16

Selected attribute: Name: handicapped-infants, Type: No..., Missi... 12 (...), Distinct: ..., Unique: 0 (0...)

Label	Count
n	236
y	187

Attributes: All | None | Invert

No.	Name
<input checked="" type="checkbox"/>	handicapped-infants
<input type="checkbox"/>	water-project-cost-sharing
<input type="checkbox"/>	adoption-of-the-budget-resolution
<input type="checkbox"/>	physician-fee-freeze
<input type="checkbox"/>	el-salvador-aid
<input type="checkbox"/>	religious-groups-in-schools
<input type="checkbox"/>	anti-satellite-test-ban
<input type="checkbox"/>	aid-to-nicaraguan-contras
<input type="checkbox"/>	mx-missile
<input type="checkbox"/>	immigration
<input type="checkbox"/>	synfuels-corporation-cutback
<input type="checkbox"/>	education-spending
<input type="checkbox"/>	superfund-right-to-sue
<input type="checkbox"/>	crime
<input type="checkbox"/>	duty-free-exports
<input type="checkbox"/>	party

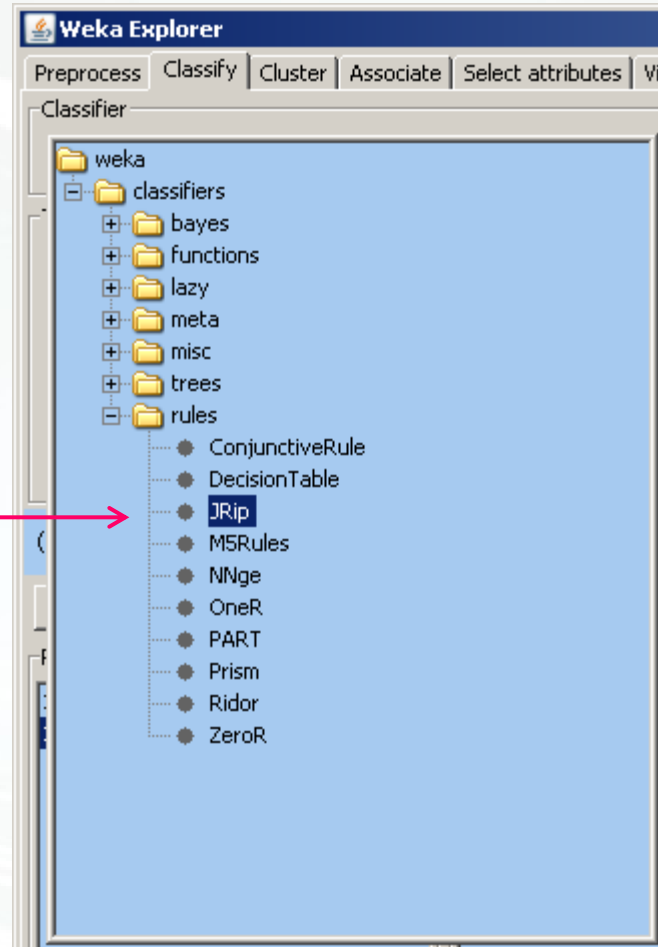
Remove

Class: party (Nom) Visualize All

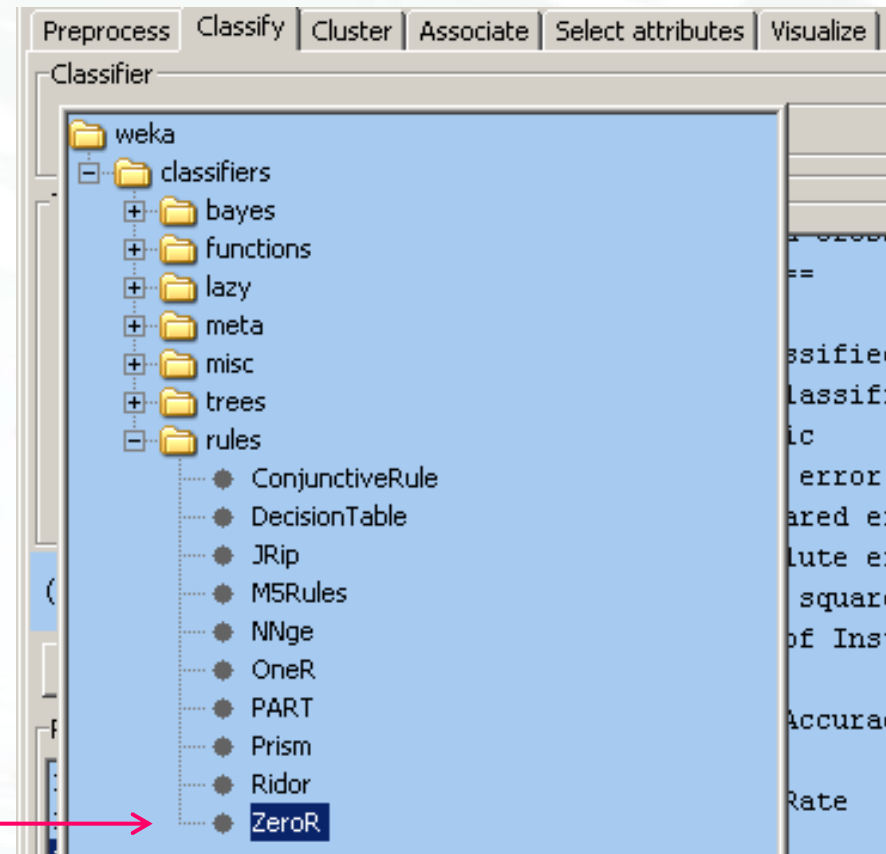
Status: OK Log x 0

Classification rules:

Weka → classifiers → rules → JRip



Baseline classifier: Weka → classifiers → rules → ZeroR



Association rules

Weka → associations → Apriori

①

②

The screenshot shows the Weka Explorer interface with the 'Associate' tab selected. The 'Apriori' algorithm is chosen, and the 'Start' button has been clicked. The 'Associator output' pane displays the results of the association rule mining process.

Associator output

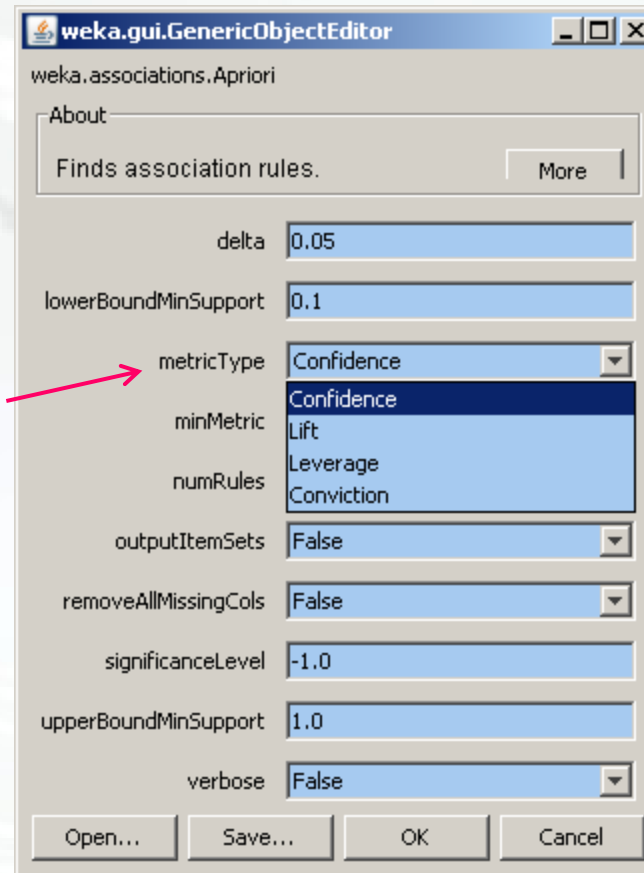
```
Size of set of large itemsets L(4): 1

Best rules found:

1. adoption-of-the-budget-resolution=y physician-fee-freeze=n 219 ==> party=democrat 219   conf: (1)
2. adoption-of-the-budget-resolution=y physician-fee-freeze=n aid-to-nicaraguan-contras=y 198 ==> party=democrat 198   conf: (1)
3. physician-fee-freeze=n aid-to-nicaraguan-contras=y 211 ==> party=democrat 210   conf: (1)
4. physician-fee-freeze=n education-spending=n 202 ==> party=democrat 201   conf: (1)
5. physician-fee-freeze=n 247 ==> party=democrat 245   conf: (0.99)
6. el-salvador-aid=n party=democrat 200 ==> aid-to-nicaraguan-contras=y 197   conf: (0.99)
7. el-salvador-aid=n 208 ==> aid-to-nicaraguan-contras=y 204   conf: (0.98)
8. adoption-of-the-budget-resolution=y aid-to-nicaraguan-contras=y party=democrat 203 ==> physician-fee-freeze=n 203   conf: (0.97)
9. el-salvador-aid=n aid-to-nicaraguan-contras=y 204 ==> party=democrat 197   conf: (0.97)
10. aid-to-nicaraguan-contras=y party=democrat 218 ==> physician-fee-freeze=n 210   conf: (0.96)
```

Status
OK

Quality of association rules



Compare classification and association rules

- Purpose
- Format
- Quality measure
- Ruleset / List of rules
- Exhaustiveness of algorithms

Comparison of classification and association rules

- Purpose
 - Classification rules: classification
 - Association rules: exploratory data analysis, descriptive induction
- Format
 - Both in the format $X \rightarrow Y$
 - Classification rules: Y is a pair “target variable=class”
 - Association rules: both X and Y are itemsets \cong conjunctions of attribute-value pairs
- Quality measure
 - Classification rules: classification accuracy of the ruleset, precision, rule accuracy, weighted relative accuracy
 - Association rules: support, confidence, lift, leverage, conviction
- Ruleset / List of rules
 - Classification rules: can be both: unordered sets of rules or ordered list of rules
 - Association rules: unordered set of rules
- Exhaustiveness of algorithms
 - Classification rules: heuristic algorithms
 - Association rules: exhaustive algorithms, guarantee the optimal results