

1. Data processing

Before test with weka, we need to deal with the two train and test files. The process is as follows:

- change the extension of files to turn the files into .csv files.
- add header to both files
- remove unknown values (instances with "?")
- change the test data. '>/<=50K.' in test file to '>/<=50K'

2. Data description

After processing, there are 30162 instances in train data and 15060 instances in the test data. For convenience and compatibility purposes, we copy and paste the test data below the train data file so there are 45222 instance in total (provided as the supplementary file 'adult.all.csv')

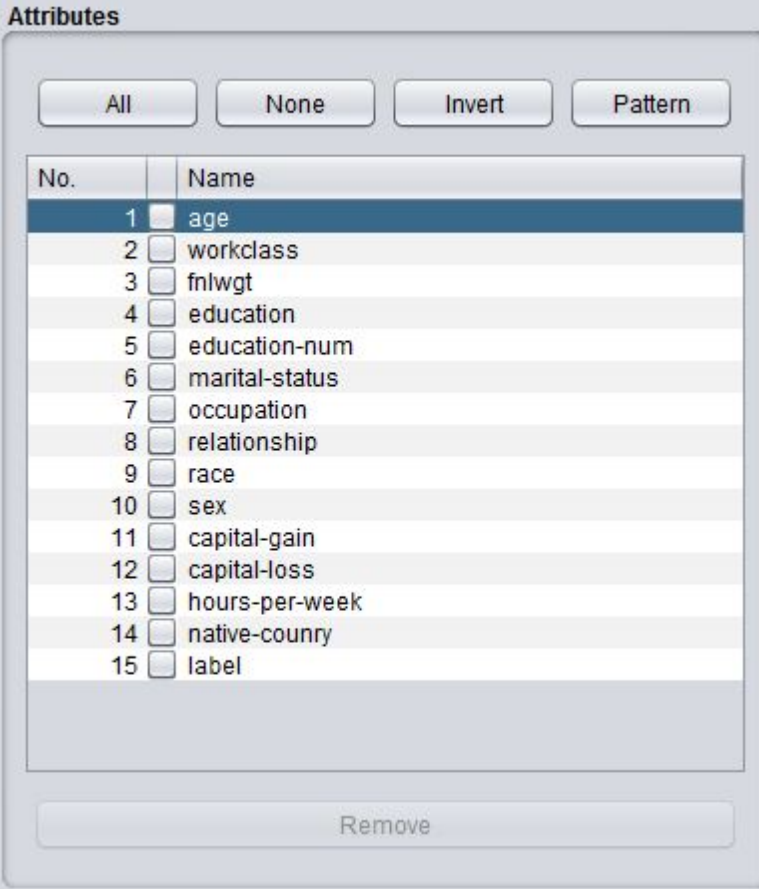
Current relation	
Relation: adult.all	Attributes: 15
Instances: 45222	Sum of weights: 45222

The 14 attributes and possible values are:

- age: continuous.
- workclass: Private, Self-emp-not-inc, Self-emp-inc, Federal-gov, Local-gov, State-gov, Without-pay, Never-worked.
- fnlwgt: continuous.
- education: Bachelors, Some-college, 11th, HS-grad, Prof-school, Assoc-acdm, Assoc-voc, 9th, 7th-8th, 12th, Masters, 1st-4th, 10th, Doctorate, 5th-6th, Preschool.
- education-num: continuous.
- marital-status: Married-civ-spouse, Divorced, Never-married, Separated, Widowed, Married-spouse-absent, Married-AF-spouse.
- occupation: Tech-support, Craft-repair, Other-service, Sales, Exec-managerial, Prof-specialty, Handlers-cleaners, Machine-op-inspct, Adm-clerical, Farming-fishing, Transport-moving, Priv-house-serv, Protective-serv, Armed-Forces.
- relationship: Wife, Own-child, Husband, Not-in-family, Other-relative, Unmarried.
- race: White, Asian-Pac-Islander, Amer-Indian-Eskimo, Other, Black.
- sex: Female, Male.
- capital-gain: continuous.
- capital-loss: continuous.
- hours-per-week: continuous.
- native-country: United-States, Cambodia, England, Puerto-Rico, Canada, Germany, Outlying-US(Guam-USVI-etc), India, Japan, Greece, South, China, Cuba, Iran, Honduras, Philippines, Italy, Poland, Jamaica, Vietnam, Mexico, Portugal, Ireland, France, Dominican-Republic, Laos, Ecuador, Taiwan, Haiti, Columbia, Hungary,

Guatemala, Nicaragua, Scotland, Thailand, Yugoslavia, El-Salvador,
Trinidad&Tobago, Peru, Hong, Holand-Netherlands.

And the lable: $\leq 50K$ or $>50K$



The 'Attributes' dialog box in Weka contains a table with 15 attributes. Each attribute has a checkbox next to its name. The 'age' attribute (row 1) is currently selected. Below the table is a 'Remove' button.

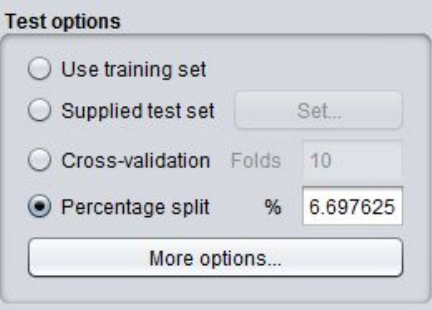
No.	Name
1	<input checked="" type="checkbox"/> age
2	<input type="checkbox"/> workclass
3	<input type="checkbox"/> fnlwgt
4	<input type="checkbox"/> education
5	<input type="checkbox"/> education-num
6	<input type="checkbox"/> marital-status
7	<input type="checkbox"/> occupation
8	<input type="checkbox"/> relationship
9	<input type="checkbox"/> race
10	<input type="checkbox"/> sex
11	<input type="checkbox"/> capital-gain
12	<input type="checkbox"/> capital-loss
13	<input type="checkbox"/> hours-per-week
14	<input type="checkbox"/> native-counry
15	<input type="checkbox"/> label

3. Test with classifiers

In order to replicate the methods used in the paper and use the Bayes Net, we choose 3 classifiers as follows:

- weka.classifiers.bayes.BayesNet
- weka.classifiers.trees.J48 (confidence level 0.5) (same as C4.5)
- weka.classifiers.trees.NBTree

As we put the train and test data in a single file. So in the test option, we choose percentage split with $(30162/45222 =) 66.697625\%$.



The 'Test options' dialog box shows four radio button options. The 'Percentage split' option is selected, and the percentage value '6.697625' is entered in the adjacent text field. A 'More options...' button is located at the bottom.

☐ Use training set

☐ Supplied test set

☐ Cross-validation Folds

☒ Percentage split %

4. Results

As the full replicated results from Weka 3.8.1 are too long in content, they are provided in the supplementary files as 'BayesNet', 'J48' and 'NBTree'.

- If we compare the accuracy rate with the result of paper

The results of the paper is obtained from the source:

<https://archive.ics.uci.edu/ml/machine-learning-databases/adult/adult.names>

Paper Results	Error Accuracy reported as follows, after removal of unknowns from train/test sets): C4.5 : 84.46+-0.30 Naive-Bayes: 83.88+-0.30 NBTree : 85.90+-0.28		
J48	Correctly Classified Instances	12759	84.7211 %
	Incorrectly Classified Instances	2301	15.2789 %
BayesNet	Correctly Classified Instances	12617	83.7782 %
	Incorrectly Classified Instances	2443	16.2218 %
NBTree	Correctly Classified Instances	12924	85.8167 %
	Incorrectly Classified Instances	2136	14.1833 %

Replicated results are all within the range provided by the paper results
The classifier NBTree has the largest accuracy rate.

- If we compare the RMSE:

J48	Root mean squared error	0.3399
BayesNet	Root mean squared error	0.3421
NBTree	Root mean squared error	0.3272

The classifier NBTree has the smallest error.

- If we compare the decision trees:

As by the results of methods provided in supplementary files, we can also find that NBTree has far fewer nodes than J48.

5. Conclusion

After data cleaning, we reach the same instance amounts as with the paper. Our replicated results are all within the range of those provided by the paper. Generally speaking, from the perspective of accuracy rate, error terms and the complexity of decision trees, the classifier NBTree performs better in the study and estimation of the dataset adult.all.