

Machine Learning Assignment
Analysis of Name Characteristics Using J48 and other Classifiers

Submitted By:

Name: Saira Shairi
Registratin No: SP24-RCS-023

Submitted To:

Dr. Muhammad Sharjeel

Date:06-10-2024

Introduction:

In this assignment, I explore the application of machine learning classifiers to a dataset of names, and try to understand understanding how various name characteristics influence classification outcomes. The dataset consists of names labeled with +,-,y,n etc outcomes, and main objective is to identify patterns in the names that could be used for classification. For this, I manually extracted several features from the names, like second letter is a vowel, whether the name starts or ends with a vowel, and whether the length of the name is even or odd. For this analysis I have used classifiers mainly the J48 decision tree and some other classifier. This assignment offering an opportunity to better understand the full machine learning pipeline, from feature extraction to model evaluation.

Features and Dataset Explanation:

To effectively classify names based on their characteristics, I manually extracted several features from the dataset. The features extracted include:

1. 2nd alphabet is vowel
2. Length is even or odd
3. Name of girl or boy
4. Name Starts with a vowel

After extracting these features, I converted the dataset into ARFF format to ensure compatibility with the WEKA machine learning environment.

Methodology:

The dataset was formatted into ARFF, making it compatible with WEKA, a popular machine learning tool. I applied different classifiers: the J48 decision tree and the Logistic Model Tree (LMT).

Classifier Outputs for Individual Attributes

I have included screenshots of the outputs obtained after running the classifiers on each attribute individually.

1. 2nd Alphabet is vowel:

Correctly classified instances 84 %

Incorrectly classified instances 16%

The screenshot shows the Weka Explorer interface. The 'Classifier' tab is active, and the 'J48 -C 0.25 -M 2' model is selected. The 'Test options' section shows 'Cross-validation' with 'Folds' set to 10. The 'Result list' on the left shows two entries: '07:31:58 - trees.J48' and '07:32:18 - trees.J48', with the latter selected. The 'Classifier output' pane displays the following information:

Size of the tree : 3

Time taken to build model: 0.01 seconds

=== Stratified cross-validation ===

=== Summary ===

Correctly Classified Instances	84	84	%
Incorrectly Classified Instances	16	16	%
Kappa statistic	0.68		
Mean absolute error	0.271		
Root mean squared error	0.3733		
Relative absolute error	54.1984 %		
Root relative squared error	74.6578 %		
Total Number of Instances	100		

=== Detailed Accuracy By Class ===

	TP Rate	FP Rate	Precision	Recall	F-Measure	MCC	ROC Area	PRC Area	Class
	0.780	0.100	0.886	0.780	0.830	0.685	0.748	0.725	-
	0.900	0.220	0.804	0.900	0.849	0.685	0.748	0.675	+
Weighted Avg.	0.840	0.160	0.845	0.840	0.839	0.685	0.748	0.700	

=== Confusion Matrix ===

```
a b <-- classified as
39 11 | a = -
5 45 | b = +
```

2. Last is vowel

Correctly classified instances 75 %

Incorrectly classified instances 25%

The screenshot shows the Weka Explorer interface with the 'Classify' tab selected. The classifier chosen is 'J48 -C 0.25 -M 2'. The test options are set to 'Cross-validation' with 'Folds' set to 10. The classifier output is displayed, showing a tree size of 9 and a time taken to build the model of 0 seconds. The stratified cross-validation summary shows 75 correctly classified instances and 25 incorrectly classified instances, with a kappa statistic of 0.4672. The detailed accuracy by class table shows a weighted average accuracy of 0.751 for class 'f'. The confusion matrix shows 25 instances classified as 't' and 14 instances classified as 'f'.

Classifier output

Size of the tree : 9

Time taken to build model: 0 seconds

=== Stratified cross-validation ===

=== Summary ===

Correctly Classified Instances	75	75	%
Incorrectly Classified Instances	25	25	%
Kappa statistic	0.4672		
Mean absolute error	0.2903		
Root mean squared error	0.4075		
Relative absolute error	62.8029 %		
Root relative squared error	84.7834 %		
Total Number of Instances	100		

=== Detailed Accuracy By Class ===

	TP Rate	FP Rate	Precision	Recall	F-Measure	MCC	ROC Area	PRC Area	Class
	0.694	0.219	0.641	0.694	0.667	0.468	0.775	0.661	t
	0.781	0.306	0.820	0.781	0.800	0.468	0.775	0.802	f
Weighted Avg.	0.750	0.274	0.755	0.750	0.752	0.468	0.775	0.751	

=== Confusion Matrix ===

a b <-- classified as

25 11 | a = t

14 50 | b = f

3. Vowel starts a name

Correctly classified instances 88 %

Incorrectly classified instances 12%

The screenshot shows the Weka Explorer interface with the 'Classify' tab selected. The classifier chosen is 'J48 -C 0.25 -M 2'. The test options are set to 'Cross-validation' with 'Folds' set to 10. The classifier output is displayed, showing a tree size of 7 and a time taken to build the model of 0 seconds. The stratified cross-validation summary shows 88 correctly classified instances and 12 incorrectly classified instances, with a kappa statistic of 0.7541. The detailed accuracy by class table shows a weighted average accuracy of 0.847 for class 'n'. The confusion matrix shows 36 instances classified as 'y' and 4 instances classified as 'n'.

Classifier output

Size of the tree : 7

Time taken to build model: 0 seconds

=== Stratified cross-validation ===

=== Summary ===

Correctly Classified Instances	88	88	%
Incorrectly Classified Instances	12	12	%
Kappa statistic	0.7541		
Mean absolute error	0.1907		
Root mean squared error	0.3286		
Relative absolute error	38.6393 %		
Root relative squared error	66.1318 %		
Total Number of Instances	100		

=== Detailed Accuracy By Class ===

	TP Rate	FP Rate	Precision	Recall	F-Measure	MCC	ROC Area	PRC Area	Class
	0.818	0.071	0.900	0.818	0.857	0.757	0.872	0.853	y
	0.929	0.182	0.867	0.929	0.897	0.757	0.872	0.842	n
Weighted Avg.	0.880	0.133	0.881	0.880	0.879	0.757	0.872	0.847	

=== Confusion Matrix ===

a b <-- classified as

36 8 | a = y

4 52 | b = n

4. length is even or odd

Correctly classified instances 99 %

Incorrectly classified instances 1%

The screenshot shows the Weka Explorer interface with the J48 classifier selected. The 'Test options' section is set to 'Cross-validation' with 10 folds. The 'Classifier output' pane displays the following results:

```
Size of the tree : 7

Time taken to build model: 0 seconds

=== Stratified cross-validation ===
=== Summary ===

Correctly Classified Instances      99      99 %
Incorrectly Classified Instances    1      1 %
Kappa statistic                    0.98
Mean absolute error                 0.0202
Root mean squared error             0.104
Relative absolute error              4.0475 %
Root relative squared error         20.7922 %
Total Number of Instances          100

=== Detailed Accuracy By Class ===

      TP Rate  FP Rate  Precision  Recall  F-Measure  MCC   ROC Area  PRC Area  Class
1.000    0.019    0.980    1.000    0.990    0.980  0.988    0.974    -
0.981    0.000    1.000    0.981    0.990    0.980  0.988    0.991    +
Weighted Avg.  0.990    0.009    0.990    0.990    0.990    0.980  0.988    0.983

=== Confusion Matrix ===

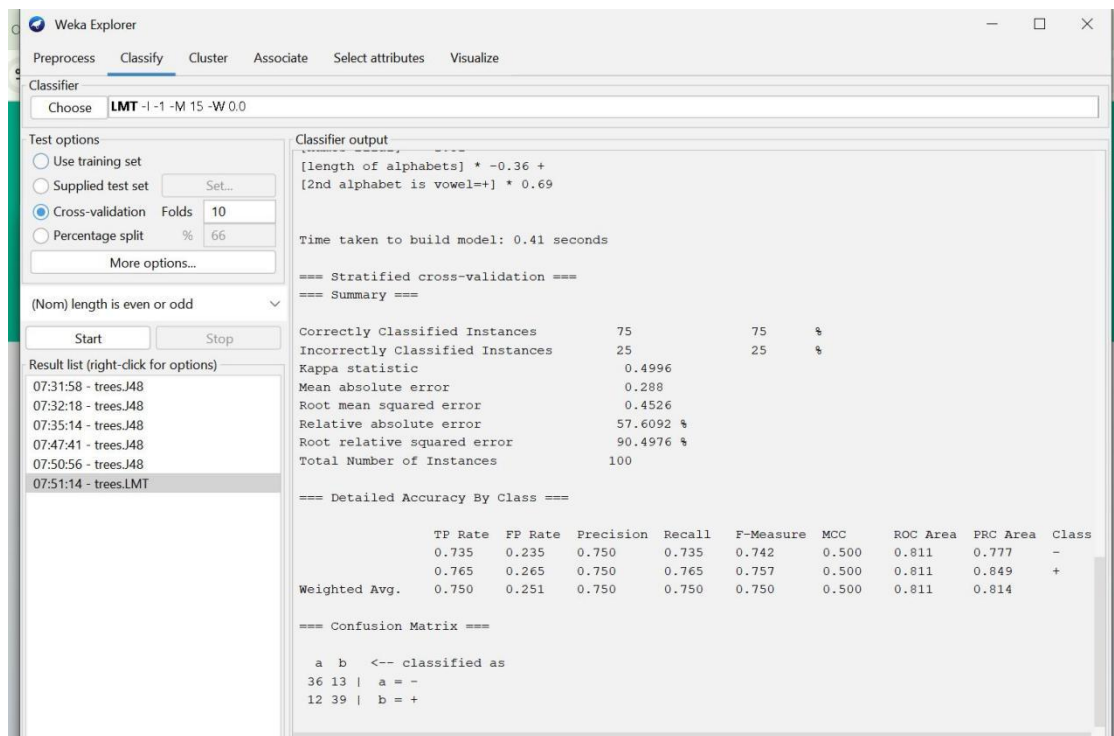
  a  b  <-- classified as
48  0  |  a = -
 1 51  |  b = +
```

Results:

In this task I have applied J48 decision tree algorithm on my data-set. From my dataset when I choose attribute (**length is even or odd**) it shows high accuracy 99% and show 1 incorrectly classified instance. When I try to correct that 1 incorrectly classified instance by rechecking my dataset and find out that I have make mistake at one place then I correct that mistake and again apply algorithm the **interesting thing** which I have noticed is that its accuracy drop to 70's range from 99%. So, I observe this shift in accuracy shows the potential overfitting in the previous model when it was just dependent on a single attribute, as well as how sensitive decision trees may be to slight changes in data.

Logistic Model Tree (LMT) classifier Result:

I have applied other algorithms also but here I share (LMT) results



The screenshot shows the Weka Explorer interface with the LMT classifier selected. The classifier output pane displays the following results:

```
[length of alphabets] * -0.36 +
[2nd alphabet is vowel=+] * 0.69
```

Time taken to build model: 0.41 seconds

=== Stratified cross-validation ===
=== Summary ===

Metric	Value	Percentage
Correctly Classified Instances	75	75 %
Incorrectly Classified Instances	25	25 %
Kappa statistic	0.4996	
Mean absolute error	0.288	
Root mean squared error	0.4526	
Relative absolute error	57.6092 %	
Root relative squared error	90.4976 %	
Total Number of Instances	100	

=== Detailed Accuracy By Class ===

	TP Rate	FP Rate	Precision	Recall	F-Measure	MCC	ROC Area	PRC Area	Class
	0.735	0.235	0.750	0.735	0.742	0.500	0.811	0.777	-
	0.765	0.265	0.750	0.765	0.757	0.500	0.811	0.849	+
Weighted Avg.	0.750	0.251	0.750	0.750	0.750	0.500	0.811	0.814	

=== Confusion Matrix ===

```
a b <-- classified as
36 13 | a = -
12 39 | b = +
```

1.length is even or odd

Correctly classified instances 75 %

Incorrectly classified instances 25%

Result:

I have also applied Logistic Model Tree (LMT) classifier on same above dataset attribute (**length is even or odd**). The model achieved 75% accuracy, correctly classifying 75 instances and misclassifying 25. Interestingly J48 initially achieved 99% accuracy, but this was reduced to the 70s range after fixing a mislabeled instance, revealing signs of overfitting. In contrast, LMT yielded a consistent 75% accuracy, demonstrating its stability when applied to the same set of features. This process highlighted the sensitivity of decision trees to data variations and the importance of selecting robust classifiers for reliable performance.

Conclusion:

In this assignment I have examined the application of machine learning classifiers to analyze name characteristics through feature extraction. The classifiers used demonstrated varying levels of accuracy, emphasizing the complexities of model training and the influence of data quality on performance. The experience underscored the significance of careful feature selection and data preprocessing in the machine learning pipeline.