

A List of [Binary] Classification Models' Evaluation Metrics

Calculated by WEKA

67 metrics

By: Noureddin Sadawi

31 Jul 2014

This is a list of metrics that WEKA generates for evaluating [binary] classifiers. Notice that a simple definition has been provided for each of them (definitions were extracted from WEKA's source files).

I have studied WEKA's source code and have worked out which metrics can be considered primary (i.e. calculated from the data) and which metrics are secondary (i.e. calculated from primary metrics). The results of this study are reported in the file: weka-params.pdf

1. **Basic performance stats - right vs wrong**

- (a) **Correct:** Gets the number of instances correctly classified (that is, for which a correct prediction was made).
- (b) **pct Correct:** Gets the percentage of instances correctly classified (that is, for which a correct prediction was made).
- (c) **pct Incorrect:** Gets the percentage of instances incorrectly classified (that is, for which an incorrect prediction was made).
- (d) **Incorrect:** Gets the number of instances incorrectly classified (that is, for which an incorrect prediction was made).
- (e) **pct Unclassified:** Gets the percentage of instances not classified (that is, for which no prediction was made by the classifier).

2. **IR stats** **Expose2 class_prediction_evaluation_measure**

- (a) **Kappa:** **Expose2 kappa_statistic** Returns value of kappa statistic if class is nominal.
- (b) **Unclassified:** **Expose2 number_of_unclassified_instances** Gets the number of instances not classified (that is, for which no prediction was made by the classifier).

- (c) **total Cost:** `Expose2 total_cost` Gets the total cost, that is, the cost of each prediction times the weight of the instance, summed over all instances.
- (d) **avg Cost:** `Expose2 average_cost` Gets the average cost, that is, total cost of misclassifications (incorrect plus unclassified) over the total number of instances.
- (e) **confusion Matrix:** `Expose2 confusion_matrix` Returns a copy of the confusion matrix.
- (f) **error Rate:** `Expose2 error_rate` Returns the estimated error rate or the root mean squared error (if the class is numeric).

3. **IR stats** `Expose2 primitive_evaluation_measure`

- (a) **num True Negatives [requires class index]:** `Expose2 number_of_true_negatives` Calculate the number of true negatives with respect to a particular class.
- (b) **num True Positives [requires class index]:** `Expose2 number_of_true_positives` Calculate the number of true positives with respect to a particular class.
- (c) **num FalseNegatives [requires class index]:** `Expose2 number_of_false_negatives` Calculate number of false negatives with respect to a particular class.
- (d) **num False Positives [requires class index]:** `Expose2 number_of_false_positives` Calculate number of false positives with respect to a particular class.

4. **IR stats** `Expose2 binary_prediction_evaluation_measure`

- (a) **Area Under ROC [requires class index]:** `Expose2 area_under_the_ROC_curve` Returns the area under ROC for those predictions that have been collected in the `evaluateClassifier(Classifier, Instances)` method.
- (b) **precision [requires class index]:** `Expose2 precision` Calculate the precision with respect to a particular class.
- (c) **recall [requires class index]:** `Expose2 recall` Calculate the recall with respect to a particular class.
- (d) **true Negative Rate (specificity) [requires class index]:** `Expose2 specificity` Calculate the true negative rate with respect to a particular class.
- (e) **true Positive Rate (sensitivity) [requires class index]** `Expose2 recall` Calculate the true positive rate with respect to a particular class.

- (f) **fMeasure [requires class index]:** **Expose f-measure** Calculate the F-Measure with respect to a particular class.
- (g) **matthews Correlation Coefficient [requires class index]:** **Expose Matthews_correlation** Calculates the matthews correlation coefficient (sometimes called phi coefficient) for the supplied class

5. **IR stats**

- (a) **false Negative Rate [requires class index]:** Calculate the false negative rate with respect to a particular class.
- (b) **false Positive Rate [requires class index]:** Calculate the false positive rate with respect to a particular class.

6. **Weighted IR stats (in expose as: per-class evaluation measures):**

Expose has average fmeasure, average precision, average recall, per-class AUROC, per-class f-measure, per-class precision and per-class recall.

It is NOT clear to me whether they are the same as the following!

- (a) **weighted Area Under ROC:** **Expose2** Calculates the weighted (by class size) AUC.
- (b) **weighted False Negative Rate:** Calculates the weighted (by class size) false negative rate.
- (c) **weighted False Positive Rate:** Calculates the weighted (by class size) false positive rate.
- (d) **weighted FMeasure:** **Expose2 weighted_f-measure** Calculates the macro weighted (by class size) average F-Measure.
- (e) **weighted Precision:** Calculates the weighted (by class size) precision.
- (f) **weighted Recall:** Calculates the weighted (by class size) recall.
- (g) **weighted True Negative Rate:** Calculates the weighted (by class size) true negative rate.
- (h) **weighted True Positive Rate:** Calculates the weighted (by class size) true positive rate.

7. **SF stats**

- (a) **SF Entropy Gain:** Returns the total SF, which is the null model entropy minus the scheme entropy.
- (b) **SF Mean Entropy Gain:** Returns the SF per instance, which is the null model entropy minus the scheme entropy, per instance.

- (c) **SF Mean Prior Entropy:** Returns the entropy per instance for the null model.
 - (d) **SF Mean Scheme Entropy:** Returns the entropy per instance for the scheme
 - (e) **SF Prior Entropy:** Returns the total entropy for the null model.
 - (f) **SF Scheme Entropy:** Returns the total entropy for the scheme.
8. **Sensitive stats - certainty of predictions** `Expose2 class_probability-based_evaluation_measure`
- (a) **relative Absolute Error:** `Expose2 relative_absolute_error` Returns the relative absolute error.
 - (b) **root Mean Squared Error:** `Expose2 root_mean-squared_error` Returns the root mean squared error.
 - (c) **root Relative Squared Error:** `Expose2 root_relative_squared_error` Returns the root relative squared error if the class is numeric.
 - (d) **mean Absolute Error:** `Expose2 mean_absolute_error` Returns the mean absolute error.
9. **K&B stats (in expose as: info based measures):** `Expose2 information-based_measures`
- (a) **KB Information:** `Expose2 Kononenko-Bratko_information_score` Return the total Kononenko & Bratko Information score in bits.
 - (b) **KB Mean Information:** `Expose2 Kononenko-Bratko_average_information_score` Return the Kononenko & Bratko Information score in bits per instance.
 - (c) **KB Relative Information:** `Expose2 Kononenko-Bratko_relative_information_score` Return the Kononenko & Bratko Relative Information score.
10. **area Under PRC [requires class index]:** Returns the area under precision-recall curve (AUPRC) for those predictions that have been collected in the `evaluateClassifier(Classifier, Instances)` method.
11. **correlation Coefficient:** Returns the correlation coefficient if the class is numeric.
12. **coverage Of Test Cases By Predicted Regions:** Gets the coverage of the test cases by the predicted regions at the confidence level specified when evaluation was performed.
13. **getClassPriors:** Get the current weighted class counts.

14. **mean Prior Absolute Error:** Returns the mean absolute error of the prior.
15. **num Instances:** Gets the number of test instances that had a known class value (actually the sum of the weights of test instances with known class values)
16. **prior Entropy:** Calculate the entropy of the prior distribution.
17. **root Mean Prior Squared Error:** Returns the root mean prior squared error.
18. **size Of Predicted Regions:** Gets the average size of the predicted regions, relative to the range of the target in the training data, at the confidence level specified when evaluation was performed
19. **unweighted Macro Fmeasure:** Unweighted macro-averaged F-measure.
20. **unweighted Micro Fmeasure:** Unweighted micro-averaged F-measure.
21. **weighted Area Under PRC:** Calculates the weighted (by class size) AUPRC.
22. **weighted Matthews Correlation:** Calculates the weighted (by class size) matthews correlation coefficient.
23. Number_of_training_instances
24. Number_of_testing_instances
25. Elapsed_Time_training
26. Elapsed_Time_testing
27. UserCPU_Time_training
28. UserCPU_Time_testing
29. Serialized_Model_Size
30. Serialized_Train_Set_Size
31. Serialized_Test_Set_Size
32. **From Expose**

(a) **Balanced Classification Rate:** $((TP / (TP + FN) + TN / (TN + FP))) / 2$

Also known as HTER: Half Total Error Rate

- (b) **Discriminant Power** normalised likelihood index, $j_1 = \text{poor}$, $j_3 = \text{good, fair otherwise}$.

$$\frac{\sqrt{3}}{2} \cdot (\log(\text{sensitivity} / (1 - \text{specificity})) + \log(\text{specificity} / (1 - \text{sensitivity})))$$
- (c) **Youden's Index:** arithmetic mean between sensitivity and specificity.

$$\text{sensitivity} - (1 - \text{specificity})$$
- (d) **Negative Likelihood:** likelihood that a predicted negative is an actual negative.

$$\text{specificity} / (1 - \text{sensitivity})$$
- (e) **Positive Likelihood:** likelihood that a predicted positive is an actual positive.

$$\text{sensitivity} / (1 - \text{specificity})$$