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Name	LogisticRegression
Version	1.0.0
Description	Logistic Regression implementation
License	http://www.apache.org/licenses/LICENSE-2.0
Copyright	Copyright (C) 2017 HPCC Systems
Authors	HPCCSystems
DependsOn	ML_Core, PBblas
Platform	6.2.0

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Binomial Confusion

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DESCRIPTIONS

FUNCTION BinomialConfusion

DATASET(Types.Binomial_Confusion_Summary)	BinomialConfusion
(DATASET(Core_Types.Confusion_Detail) d)	

Binomial confusion matrix. Work items with multinomial responses are ignored by this function. The higher value lexically is considered to be the positive indication.

PARAMETER $\underline{\mathbf{d}}$ confusion detail for the work item and classifier

RETURN confusion matrix for a binomial classifier

BinomialLogisticRegression

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IMPORTS

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DESCRIPTIONS

MODULE BinomialLogisticRegression

BinomialLogisticRegression

(UNSIGNED max_iter=200, REAL8 epsilon=Constants.default_epsilon, REAL8 ridge=Constants.default_ridge)

Binomial logistic regression using iteratively re-weighted least squares.

PARAMETER max_iter maximum number of iterations to try

PARAMETER epsilon the minimum change in the Beta value estimate to continue

PARAMETER <u>ridge</u> a value to populate a diagonal matrix that is added to a matrix help assure that the matrix is invertible.

Children

- 1. GetModel: Calculate the model to fit the observation data to the observed classes
- 2. Classify: Classify the observations using a model
- 3. Report: Report the confusion matrix for the classifier and training data

FUNCTION GetModel

BinomialLogisticRegression \

DATASET(Types.Layout_Model)	$\operatorname{GetModel}$
(DATASET(Types.NumericField) DATASET(Types.DiscreteField)	•

Calculate the model to fit the observation data to the observed classes.

PARAMETER <u>observations</u> the observed explanatory values

PARAMETER <u>classifications</u> the observed classification used to build the model

RETURN the encoded model

OVERRIDE True

FUNCTION Classify

 $BinomialLogisticRegression \setminus$

DATASET(Types.Classify_Result)	Classify
(DATASET(Types.Layout_Model) mo DATASET(Types.NumericField) new	

Classify the observations using a model.

PARAMETER model The model, which must be produced by a corresponding getModel function.

PARAMETER new_observations observations to be classified

RETURN Classification with a confidence value

OVERRIDE True

FUNCTION Report

BinomialLogisticRegression \

```
DATASET(Types.Confusion_Detail) Report

(DATASET(Types.Layout_Model) model,
DATASET(Types.NumericField) observations,
DATASET(Types.DiscreteField) classifications)
```

Report the confusion matrix for the classifier and training data.

PARAMETER model the encoded model

PARAMETER observations the explanatory values.

PARAMETER <u>classifications</u> the classifications associated with the observations

RETURN the confusion matrix showing correct and incorrect results

OVERRIDE True

Confusion

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ML_Core | ML_Core.Types | Types |

DESCRIPTIONS

FUNCTION Confusion

DATASET(Confusion_Detail)	Confusion
(DATASET(DiscreteField) de	pendents, DATASET(DiscreteField)
predicts)	

Detail confusion records to compare actual versus predicted response variable values.

PARAMETER dependents the original response values

PARAMETER predicts the predicted responses

RETURN confusion counts by predicted and actual response values.

Constants

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DESCRIPTIONS

MODULE Constants

Constants

Children

- 1. limit_card
- 2. default_epsilon
- 3. default_ridge
- 4. local_cap
- 5. id_base
- 6. id_iters
- 7. id_delta
- 8. id_correct
- 9. id_incorrect
- $10. \ id_stat_set$
- 11. id_betas
- 12. id_betas_coef
- 13. id_betas_SE
- 14. base_builder
- 15. base_max_iter
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builder_softmax

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DESCRIPTIONS

FUNCTION DataStats

DATASET(Types.Data_Info) DataStats

(DATASET(Core_Types.NumericField) indep,
DATASET(Core_Types.DiscreteField) dep, BOOLEAN
field_details=FALSE)

Information about the datasets. Without details the range for the x and y (independent and dependent) columns. Note that a column of all zero values cannot be distinguished from a missing column. When details are requested, the cardinality, minimum, and maximum values are returned. A zero cardinality is returned when the field cardinality exceeds the Constants.limit_card value.

PARAMETER indep data set of independent variables

PARAMETER dep data set of dependent variables

PARAMETER field_details Boolean directive to provide field level info

Deviance_Analysis

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Types |

DESCRIPTIONS

FUNCTION Deviance_Analysis

DATASET(Types.AOD_Record) Deviance_Analysis

(DATASET(Types.Deviance_Record) proposed,
DATASET(Types.Deviance_Record) base)

Compare deviance information for an analysis of deviance.

PARAMETER proposed the proposed model

PARAMETER base the base model for comparison

RETURN the comparison of the deviance between the models

Deviance_Detail

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IMPORTS

ML_Core | ML_Core.Types | Types |

DESCRIPTIONS

FUNCTION Deviance_Detail

DATASET(Types.Observation_Deviance) Deviance_Detail

(DATASET(Core_Types.DiscreteField) dependents,
DATASET(Types.Raw Prediction) predicts)

Detail deviance for each observation.

PARAMETER dependents original dependent records for the model

PARAMETER predicts the predicted values of the response variable

RETURN the deviance information by observation and the log likelihood of the predicted result.

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IMPORTS

std.blas | std.BLAS.Types |

DESCRIPTIONS

EMBED dimm

```
Types.matrix_t dimm

(BOOLEAN transposeA, BOOLEAN transposeB, BOOLEAN diagonalA, BOOLEAN diagonalB, Types.dimension_t m, Types.dimension_t n,

Types.dimension_t k, Types.value_t alpha, Types.matrix_t A,

Types.matrix_t B, Types.value_t beta=0.0, Types.matrix_t C=[])
```

Matrix multiply when either A or B is a diagonal and is passed as a vector. alpha*op(A) op(B) + beta*C where op() is transpose

PARAMETER transpose true when transpose of A is used

PARAMETER transpose true when transpose of B is used

PARAMETER diagonal true when A is the diagonal matrix

PARAMETER diagonal true when B is the diagonal matrix

PARAMETER m number of rows in product

PARAMETER n number of columns in product

PARAMETER k number of columns/rows for the multiplier/multiplicand

PARAMETER alpha scalar used on A

PARAMETER <u>A</u> matrix A

PARAMETER B matrix B

PARAMETER beta scalar for matrix C

Distributions

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ML_Core.Constants | ML_Core.Math |

DESCRIPTIONS

MODULE Distributions

Distributions

Children

- 1. Normal_CDF : Cumulative Distribution of the standard normal distribution, the probability that a normal random variable will be smaller than x standard deviations above or below the mean
- 2. Normal PPF: Normal Distribution Percentage Point Function
- 3. T_CDF: Students t distribution integral evaluated between negative infinity and x
- 4. T_PPF: Percentage point function for the T distribution
- 5. Chi2 CDF: The cumulative distribution function for the Chi Square distribution
- 6. Chi2_PPF: The Chi Squared PPF function

FUNCTION Normal_CDF

Distributions \

REAL8 Normal_CDF

(REAL8 x)

Cumulative Distribution of the standard normal distribution, the probability that a normal random variable will be smaller than x standard deviations above or below the mean. Taken from C/C++ Mathematical Algorithms for Scientists and Engineers, n. Shammas, McGraw-Hill, 1995

PARAMETER $\underline{\mathbf{x}}$ the number of standard deviations

FUNCTION Normal_PPF

Distributions \

REAL8 Normal_PPF

(REAL8 x)

Normal Distribution Percentage Point Function. Translated from C/C++ Mathematical Algorithms for Scientists and Engineers, N. Shammas, McGraw-Hill, 1995

PARAMETER $\underline{\mathbf{x}}$ probability

FUNCTION T_CDF

Distributions \

REAL8 T_CDF

(REAL8 x, REAL8 df)

Students t distribution integral evaluated between negative infinity and x. Translated from NIST SEL DATAPAC Fortran TCDF.f source

PARAMETER $\underline{\mathbf{x}}$ value of the evaluation

PARAMETER df degrees of freedom

FUNCTION T_PPF

Distributions \

```
REAL8 T_PPF

(REAL8 x, REAL8 df)
```

Percentage point function for the T distribution. Translated from NIST SEL DATAPAC Fortran TPPF.f source

FUNCTION Chi2_CDF

Distributions \

```
REAL8 Chi2_CDF

(REAL8 x, REAL8 df)
```

The cumulative distribution function for the Chi Square distribution. the CDF for the specified degrees of freedom. Translated from the NIST SEL DATAPAC Fortran subroutine CHSCDF.

FUNCTION Chi2_PPF

Distributions \

```
REAL8 Chi2_PPF

(REAL8 x, REAL8 df)
```

The Chi Squared PPF function. Translated from the NIST SEL DATAPAC Fortran subroutine CHSPPF.

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IMPORTS

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DESCRIPTIONS

FUNCTION ExtractBeta

ExtractBeta

(DATASET(Core_Types.Layout_Model) mod_ds)

Extract the beta values form the model dataset.

PARAMETER mod_ds the model dataset

RETURN a beta values as Model Coefficient records, zero as the constant term.

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DESCRIPTIONS

FUNCTION ExtractBeta_CI

Extract the beta values form the model dataset.

PARAMETER mod_ds the model dataset

PARAMETER <u>level</u> the significance value for the intervals

RETURN the beta values with confidence intervals term.

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DESCRIPTIONS

FUNCTION ExtractBeta_pval

DATASET(Types.pval_Model_Coef)	ExtractBeta_pval
(DATASET(Core_Types.Layout_Model) mod_ds)	

Extract the beta values form the model dataset.

PARAMETER mod_ds the model dataset

RETURN the beta values with p-values as Model Coefficient records, zero as the constant term.

ExtractReport

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IMPORTS

 $\operatorname{ML_Core.Types} \mid \operatorname{Types} \mid \operatorname{Constants} \mid$

DESCRIPTIONS

FUNCTION ExtractReport

DATASET(Types.Model_Report)	ExtractReport
(DATASET(Core_Types.Layout_Model) mod_ds)	

Extract Report records from model

PARAMETER mod_ds the model dataset

RETURN the model report dataset

LogitPredict

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DESCRIPTIONS

FUNCTION LogitPredict

DATASET(Classify_Result) LogitPredict

(DATASET(Model_Coef) coef, DATASET(NumericField)
independents)

Predict the category values with the logit function and the supplied beta coefficients.

PARAMETER coef the model beta coefficients

PARAMETER independents the observations

RETURN the predicted category values and a confidence score

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 $\operatorname{ML_Core.Types} \mid \operatorname{Types} \mid$

DESCRIPTIONS

FUNCTION LogitScore

DATASET(Raw_Prediction) LogitScore

(DATASET(Model_Coef) coef, DATASET(NumericField)
independents)

Calculate the score using the logit function and the supplied beta coefficients.

PARAMETER coef the model beta coefficients

PARAMETER independents the observations

RETURN the raw prediction value

Model_Deviance

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DESCRIPTIONS

FUNCTION Model_Deviance

DATASET(Types.Deviance_Record)	Model_Deviance
(DATASET(Types.Observation_Devi DATASET(Types.Model_Coef) mod)	

Model Deviance.

PARAMETER od observation deviance record

PARAMETER mod model co-efficients

RETURN model deviance

Null_Deviance

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DESCRIPTIONS

FUNCTION Null_Deviance

DATASET(Types.Deviance_Record)	Null_Deviance
(DATASET(Types.Observation_Deviance) od)	

Deviance for the null model, that is, a model with only an intercept.

PARAMETER od Observation Deviance record set.

RETURN a data set of the null model deviances for each work item and classifier.

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- 2. Field_Desc
- 3. Data_Info
- 4. NumericField_U
- 5. DiscreteField_U
- 6. Layout_Column_Map
- 7. Classifier_Stats
- 8. Model_Report
- 9. Binomial_Confusion_Summary
- 10. Model_Coef
- 11. Confidence_Model_Coef

13	. Raw_Prediction
14	. Observation_Deviance
15	. Deviance_Record
16	. AOD_Record
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Classifier_Stats
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Generate logistic regression model from training data

GetModel_global.ecl

Internal function to determine values for the model coefficients and selected statistics from building the model

$GetModel_local.ecl$

Internal function to determine values for the model co-efficients and selected stats from building the model

$\mathbf{GetModel}$

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DESCRIPTIONS

FUNCTION GetModel

DATASET(Layout_Model) GetModel

(DATASET(NumericField) independents, DATASET(DiscreteField) dependents, UNSIGNED max_iter=200, REAL8 epsilon=Constants.default_epsilon, REAL8 ridge=Constants.default_ridge)

Generate logistic regression model from training data. The size of the inputs is used to determin which work items are processed with purely local operations (the data is moved once as necessary) or with global operations supporting a work item to use multiple nodes.

PARAMETER independents the independent values

PARAMETER dependents the dependent values.

PARAMETER <u>max_iter</u> maximum number of iterations to try

PARAMETER epsilon the minimum change in the Beta value estimate to continue

PARAMETER <u>ridge</u> a value to pupulate a diagonal matrix that is added to a matrix help assure that the matrix is invertible.

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DESCRIPTIONS

FUNCTION GetModel_global

DATASET(Layout_Model) GetModel_global

(DATASET(NumericField) independents, DATASET(DiscreteField)
dependents, UNSIGNED max_iter=200, REAL8
epsilon=Constants.default_epsilon, REAL8
ridge=Constants.default_ridge)

Internal function to determine values for the model coefficients and selected statistics from building the model.

PARAMETER independents the independent values

PARAMETER dependents the dependent values

PARAMETER max_iter maximum number of iterations to try

PARAMETER epsilon the minimum change in the Beta value estimate to continue

PARAMETER <u>ridge</u> a value to pupulate a diagonal matrix that is added to a matrix help assure that the matrix is invertible.

RETURN coefficient matrix plus model building statistics

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ML_Core | ML_Core.Types | Constants | Types | IRLS | std | std.blas |

DESCRIPTIONS

FUNCTION GetModel_local

DATASET(Layout_Model) | GetModel_local

(DATASET(NumericField) independents, DATASET(DiscreteField) dependents, UNSIGNED2 max_iter=200, REAL8 epsilon=Constants.default_epsilon, REAL8 ridge=Constants.default_ridge)

Internal function to determine values for the model co-efficients and selected stats from building the model.

PARAMETER independents the independent values

PARAMETER dependents the dependent values.

PARAMETER max_iter maximum number of iterations to try

PARAMETER epsilon the minimum change in the Beta value estimate to continue

PARAMETER <u>ridge</u> a value to populate a diagonal matrix that is added to a matrix help assure that the matrix is invertible.

RETURN coefficient matrix plus model building stats

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