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LogisticRegression	
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### LinearRegression

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Name	LinearRegression	
Version	3.0.0	
Description	Linear Regression Algorithm Bundle	
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	

### **Table of Contents**

#### OLS.ecl

Ordinary Least Squares (OLS) Linear Regression aka Ordinary Linear Regression Regression learns a function that maps a set of input data (independents) to one or more output variables (dependents)

## LinearRegression/ OLS

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#### **IMPORTS**

ML\_Core | ML\_Core.Types | PBblas | PBblas.Types | PBblas.Converted | PBblas.MatUtils | ML\_Core.Math |

#### **DESCRIPTIONS**

#### **MODULE OLS**

OLS

(DATASET(NumericField) X=empty\_data, DATASET(NumericField) Y=empty\_data)

Ordinary Least Squares (OLS) Linear Regression aka Ordinary Linear Regression Regression learns a function that maps a set of input data (independents) to one or more output variables (dependents). The resulting learned function is known as the model. That model can then be used repetitively to predict (i.e. estimate) the output value(s) based on new input data. Two major use cases are supported: 1) Learn and return a model 2) Use an existing (e.g. persisted) model to predict new values for Y Of course, both can be done in a single run. Alternatively, the model can be persisted and used indefinitely for prediction of Y values, as long as the record format has not changed, and the original training data remains representative of the population. OLS supports any number of independent variables (Multiple Regression) and multiple dependent variables (Multivariate Regression). In this way, multiple variables' values can be predicted from the same input (i.e. independent) data. Training data is presented as parameters to this module. When using a previously persisted model (use case 2 above), these parameters should be omitted. This module provides a rich set of analytics to assess the usefulness of the resulting linear regression model, and to determine the best subset of independent variables to include in the model. These include: For the whole model: - Analysis of Variance (ANOVA) - R-squared - Adjusted R-squared - F-Test - Akaike Information Criterion (AIC) For each coefficient: - Standard Error (SE) -

- **PARAMETER** X The independent variable training data in DATASET(NumericField) format. Each observation (e.g. record) is identified by 'id', and each feature is identified by field number (i.e. 'number'). Omit this parameter when predicting from a persisted model.
- **PARAMETER** Y The dependent variable training data in DATASET(NumericField) format. Each observation (e.g. record) is identified by 'id', and each feature is identified by field number. Omit this parameter when predicting from a persisted model.

#### Children

- 1. GetModel: GetModel Returns the learned model that maps X's to Y's
- 2. Betas: Return raw Beta values as numeric fields Extracts Beta values from the model
- 3. Predict: Predict the dependent variable values (Y) for any set of independent variables (X)
- 4. makeRSQ
- 5. RSquared : RSquared Calculate the R-Squared Metric used to assess the fit of the regression line to the training data
- 6. AnovaRec
- 7. calcAnova
- 8. Anova: ANOVA (Analysis of Variance) report Analyzes the sources of variance
- 9. SE: Standard Error of the Regression Coefficients Describes the variability of the regression error for each coefficient
- 10. TStat: T-Statistic The T-statistic identifies the significance of the value of each regression coefficient
- 11. AdjRSquared : Adjusted R2 Calculate Adjusted R Squared which is a scaled version of R Squared that does not arbitrarily increase with the number of features
- 12. AICRec
- 13. AIC : Akaike Information Criterion (AIC) Information theory based criterion for assessing Goodness of Fit (GOF)
- 14. RangeVec
- 15. DistributionBase
- 16. TDistribution
- 17. FDistribution
- 18. NormalDistribution

- 19. pVal: P-Value Calculate the P-value for each coefficient, which is the probability that the coefficient is insignificant (i.e
- 20. ConfintRec
- 21. ConfInt: Confidence Interval The Confidence Interval determines the upper and lower bounds of each estimated coefficient given a confidence level (level) that is required
- 22. FTestRec
- 23. FTest: F-Test Calculate the P-value for the full regression, which is the probability that all of the coefficients are insignificant (i.e

#### **ATTRIBUTE** GetModel

OLS \

DATASET(Layout\_Model) GetModel

GetModel Returns the learned model that maps X's to Y's. In the case of OLS, the model represents a set of Betas which are the coefficients of the linear model: Beta0 \* 1 + Beta1 \* Field1 + Beta2 \* Field2 ... The ID of each model record specifies to which Y variable the coefficient applies. The Field Number ('number') indicates to which field of X the beta is to be applied. Field number 1 provides the intercept portion of the linear model and is always multiplied by 1. Note that if multiple work-items are provided within X and Y, there will be multiple models returned. The models can be separated by their work item id (i.e. 'wi'). A single model can be extracted from a myriad model by using e.g., model(wi=myWI\_id). GetModel should not be called when predicting using a previously persisted model (i.e. when training data was not passed to the module.

RETURN Model in DATASET(Layout\_Model) format

SEE ML\_core/Types.Layout\_Model

**OVERRIDE** True

#### **FUNCTION** Betas

OLS \

# DATASET(NumericField) Betas (DATASET(Layout\_Model) model=GetModel)

Return raw Beta values as numeric fields Extracts Beta values from the model. Can be used during training and prediction phases. For use during training phase, the 'model' parameter can be omitted. GetModel will be called to retrieve the model based on the training data. For use during prediction phase, a previously persisted model should be provided. The 'number' field of the returned NumericField records specifies to which Y the coefficient applies. The 'id' field of the returned record indicates the position of the Beta value. ID = 1 provides the Beta for the constant term (i.e. the Y intercept) while subsequent values reflect the Beta for each correspondingly numbered X feature. Feature 1 corresponds to Beta with 'id' = 2 and so on. If 'model' contains multiple work-items, Separate sets of Betas will be returned for each of the 'myriad' models (distinguished by 'wi').

PARAMETER <u>model</u> Optional parameter provides a model that was previously retrieved using GetModel. If omitted, GetModel will be used as the model.

**RETURN** DATASET(NumericField) containing the Beta values.

#### **FUNCTION** Predict

OLS \

# DATASET(NumericField) Predict (DATASET(NumericField) newX, DATASET(Layout\_Model) model=GetModel)

Predict the dependent variable values (Y) for any set of independent variables (X). Returns a predicted Y values for each observation (i.e. record) of X. This supports the 'myriad' style interface in that multiple independent work items may be present in 'newX', and multiple independent models may be provided in 'model'. The resulting predicted values will also be separable by work item (i.e. wi).

**PARAMETER** <u>newX</u> The set of observations of independent variables in DATASET(NumericField) format.

**PARAMETER** model Optional. A model that was previously returned from GetModel (above). Note that a model from a previous run will only be valid if the field numbers in X are the same as when the model was learned. If this parameter is omitted, the current model will be used.

**RETURN** An estimation of the corresponding Y value for each observation of newX. Returned in DATASET(NumericField) format with field number (i.e. 'number') indicating the dependent variable that is predicted.



#### TRANSFORM makeRSQ

OLS \

R2Rec makeRSQ (CoCoRec coco)

#### **ATTRIBUTE RSquared**

OLS \

DATASET(R2Rec) RSquared

RSquared Calculate the R-Squared Metric used to assess the fit of the regression line to the training data. Since the regression has chosen the best (i.e. least squared error) line matching the data, this can be thought of as a measurement of the linearity of the training data. R Squared generally varies between 0 and 1, with 1 indicating an exact linear fit, and 0 indicating that a linear fit will have no predictive power. Negative values are possible under certain conditions, and indicate that the mean(Y) will be more predictive than any linear fit. Moderate values of R squared (e.g. .5) may indicate that the relationship of  $X \rightarrow Y$  is non-linear, or that the measurement error is high relative to the linear correlation (e.g. many outliers). In the former case, increasing the dimensionality of X, such as by using polynomial variants of the features, may yield a better fit. R squared always increases when additional independent variables are added, so it should not be used to determine the optimal set of X variables to include. For that purpose, use Adjusted R Squared (below) which penalizes larger numbers of variables. Note that the result of this call is only meaningful during training phase (use case 1 above) as it is an analysis based on the training data which is not provided during a prediction-only phase.

**RETURN** DATASET(R2Rec) with one record per dependent variable, per work-item. The number field indicates the dependent variable and coresponds to the number field of the dependent (Y) variable to which it applies.

#### **RECORD** AnovaRec

OLS \

AnovaRec

#### TRANSFORM calcAnova

OLS \

(tmpRec le)

AnovaRec calcAnova

#### **ATTRIBUTE** Anova

OLS \

Anova

ANOVA (Analysis of Variance) report Analyzes the sources of variance. Basic ANOVA equality: Model + Error = Total Determines how much of the variance of Y is explained by the regression model, versus how much is due to the error term (i.e. unexplained variance). This attribute is only meaningful during the training phase. Provides one record per work-item. Each record provides the following statistics: - Total\_SS - Total Sum of Squares (SS) variance of the dependent data - Model\_SS - The SS variance represented within the model - Error\_SS - The SS variance not reflected by the model (i.e. Total\_SS - Error\_SS) - Total\_DF - The total degrees of freedom within the dependent data - Model\_DF - Degrees of freedom of the model - Error\_DF - Degrees of freedom of the error component - Total\_MS - The Mean Square (MS) variance represented within the model - Error\_MS - The MS variance not reflected by the model - Model\_F - The F-Test statistic: Model\_MS / Error\_MS

**RETURN** DATASET(AnovaRec), one per work-item per dependent (Y) variable The number field indicates the dependent variable to which the analysis applies.

#### ATTRIBUTE SE

#### OLS \

DATASET(NumericField)

SE

Standard Error of the Regression Coefficients Describes the variability of the regression error for each coefficient. Only meaningful during the training phase.

**RETURN** DATASET(NumericField), one record per Beta coefficient per dependent variable per work-item. The 'id' field is the coefficient number, with 1 being the Y intercept, 2 being the coefficient for the first feature, etc. The 'number' field indicates the dependent variable to which the coefficient applies.

#### **ATTRIBUTE TStat**

OLS \

DATASET(NumericField) | TStat

T-Statistic The T-statistic identifies the significance of the value of each regression coefficient. Its calculation is simply the value of the coefficient divided by the Standard Error of the coefficient. A larger absolute value of the T-statistic indicates that the coefficient is more significant. Only meaningful during the training phase.

**RETURN** DATSET(NumericField), one record per Beta coefficient per dependent variable per work-item. The 'id' field is the coefficient number, with 1 being the Y intercept, 2 being the coefficient for the first feature, etc. The number field indicates the dependent variable to which the coefficient applies.

### **ATTRIBUTE** AdjRSquared

OLS \

DATASET(R2Rec)

 ${\bf AdjRS quared}$ 

Adjusted R2 Calculate Adjusted R Squared which is a scaled version of R Squared that does not arbitrarily increase with the number of features. Adjusted R2, rather than R2 should always be used when trying to determine the best set of features to include in a model. When adding features, R2 will always increase, whether or not it improves the predictive power of the model. Adjusted R2, however, will only increase with the predictive power of the model.

**RETURN** DATASET(R2Rec), one record per dependent variable per work-item. The number field indicates the dependent variable and corresponds to the number field of the dependent (Y) variable to which it applies.

#### **RECORD AICRec**

OLS \

**AICRec** 

#### ATTRIBUTE AIC

OLS \

DATASET(AICRec) AIC

Akaike Information Criterion (AIC) Information theory based criterion for assessing Goodness of Fit (GOF). Lower values mean better fit.

**RETURN** DATASET(AICRec), one record per dependent variable per work-item. The number field indicates the dependent variable and corresponds to the number field of the dependent (Y) variable to which it applies.

### **RECORD** RangeVec

OLS \

Rar	igeVec	
Luui		

### **MODULE** DistributionBase

#### OLS \

#### DistributionBase

(t\_Count Nranges = 10000)

#### Children

- 1. Low
- 2. High
- 3. Density
- 4. RangeWidth
- 5. DensityV
- 6. CumulativeV
- 7. Cumulative
- 8. NTile
- 9. InvDensity
- 10. Discrete

### **ATTRIBUTE** Low

OLS  $\setminus$  DistributionBase  $\setminus$ 

Low

### **ATTRIBUTE** High

OLS \ DistributionBase \

High

### **FUNCTION** Density

OLS \ DistributionBase \

t\_FieldReal Density

(t\_FieldReal t)

### **ATTRIBUTE** RangeWidth

OLS \ DistributionBase \

RangeWidth

### **FUNCTION** DensityV

OLS \ DistributionBase \

DATASET(RangeVec) DensityV
()

### **FUNCTION** CumulativeV

OLS \ DistributionBase \

	CumulativeV
(	

### **FUNCTION** Cumulative

OLS \ DistributionBase \

t_FieldReal	Cumulative
(t_FieldReal t)	

### **FUNCTION NTile**

OLS  $\setminus$  DistributionBase  $\setminus$ 

```
t_FieldReal NTile
(t_FieldReal Pc)
```

### **FUNCTION** InvDensity

OLS \ DistributionBase \

	InvDensity
(	t_FieldReal delta)

### **ATTRIBUTE** Discrete

OLS \ DistributionBase \

Discrete

### **MODULE** TDistribution

OLS \

#### **TDistribution**

(t\_Discrete v\_in,t\_Count NRanges = 10000)

#### Children

- 1. DensityV
- 2. NTile
- 3. Discrete
- 4. InvDensity
- 5. High
- 6. Low
- 7. RangeWidth
- 8. Density
- 9. CumulativeV
- 10. Cumulative

### **FUNCTION** DensityV

OLS \ TDistribution \

DATASET(RangeVec) DensityV

()

**OVERRIDE** True

### **FUNCTION** NTile

OLS \ TDistribution \

t\_FieldReal NTile
(t\_FieldReal Pc)

**OVERRIDE** True

### **ATTRIBUTE** Discrete

OLS \ TDistribution \

Discrete

**INHERITED** True

### **FUNCTION** InvDensity

OLS \ TDistribution \

InvDensity

(t\_FieldReal delta)



### **ATTRIBUTE** High

OLS \ TDistribution \

High

**OVERRIDE** True

### **ATTRIBUTE** Low

 $OLS \setminus TDistribution \setminus$ 

Low

**INHERITED** True

### **ATTRIBUTE** RangeWidth

OLS \ TDistribution \

 ${\bf RangeWidth}$ 

### **FUNCTION** Density

OLS \ TDistribution \

t\_FieldReal Density
(t\_FieldReal t)

**OVERRIDE** True

### **FUNCTION** CumulativeV

OLS \ TDistribution \

CumulativeV ()

**OVERRIDE** True

### **FUNCTION** Cumulative

OLS \ TDistribution \

t\_FieldReal Cumulative (t\_FieldReal t)

### **MODULE** FDistribution

#### OLS \

#### **FDistribution**

(t\_Discrete d1\_in, t\_Discrete d2\_in, t\_Count NRanges = 10000)

#### Children

- 1. DensityV
- 2. CumulativeV
- 3. Cumulative
- 4. NTile
- 5. InvDensity
- 6. Discrete
- 7. Low
- 8. High
- 9. RangeWidth
- 10. Density

### **FUNCTION** DensityV

#### OLS \ FDistribution \

DATASET(RangeVec)	DensityV
()	

### **FUNCTION** CumulativeV

OLS \ FDistribution \

CumulativeV ()

**OVERRIDE** True

### **FUNCTION** Cumulative

OLS \ FDistribution \

t\_FieldReal Cumulative
(t\_FieldReal t)

**OVERRIDE** True

### **FUNCTION** NTile

OLS \ FDistribution \

t\_FieldReal NTile
(t\_FieldReal Pc)

### **FUNCTION** InvDensity

OLS \ FDistribution \

InvDensity

(t FieldReal delta)

**INHERITED** True

### **ATTRIBUTE** Discrete

OLS \ FDistribution \

Discrete

INHERITED

### **ATTRIBUTE** Low

OLS \ FDistribution \

Low

**INHERITED** True

### **ATTRIBUTE** High

OLS \ FDistribution \

High **OVERRIDE** True **ATTRIBUTE** RangeWidth OLS \ FDistribution \ RangeWidth OVERRIDE True **FUNCTION** Density OLS \ FDistribution \ t\_FieldReal Density (t FieldReal t) **OVERRIDE** True

### **MODULE** NormalDistribution

OLS \

NormalDistribution
(t\_Count NRanges)

#### Children

1.	Low
2.	High
3.	RangeWidth
4.	DensityV
5.	CumulativeV
6.	Cumulative
7.	NTile
8.	InvDensity
9.	Discrete
10.	Density
ΔΤΊ	TRIBUTE Low
,	
OLS	\ NormalDistribution \
L	ow
INH	ERITED True
ATT	TRIBUTE High
OI G	
OLS	\ NormalDistribution \
Н	igh
INH	ERITED True

### **ATTRIBUTE** RangeWidth

OLS  $\setminus$  NormalDistribution  $\setminus$ 

RangeWidth

**OVERRIDE** True

### **FUNCTION** DensityV

 $OLS \setminus NormalDistribution \setminus$ 

DATASET(RangeVec) DensityV

()

**OVERRIDE** True

### **FUNCTION** CumulativeV

OLS \ NormalDistribution \

CumulativeV

()

**OVERRIDE** True

### **FUNCTION** Cumulative

 $OLS \setminus NormalDistribution \setminus$ 

Cumulative t\_FieldReal (t\_FieldReal t) **OVERRIDE** True **FUNCTION** NTile  $OLS \setminus NormalDistribution \setminus$ t\_FieldReal NTile (t\_FieldReal Pc) **OVERRIDE** True **FUNCTION** InvDensity  $OLS \setminus NormalDistribution \setminus$ InvDensity (t\_FieldReal delta) INHERITED True **ATTRIBUTE** Discrete

OLS \ NormalDistribution \

Discrete



### **FUNCTION** Density

OLS \ NormalDistribution \

t\_FieldReal | Density

(t\_FieldReal t)

**OVERRIDE** True

### **ATTRIBUTE** pVal

OLS \

pVal

P-Value Calculate the P-value for each coefficient, which is the probability that the coefficient is insignificant (i.e. actually zero). A low P-value (e.g. .05) provides evidence that the coefficient is significant in the model. A high P-value indicates that the coefficient value should, in fact, be zero. P-value is related to the T-Statistic, and can be thought of as a normalized version of the T-Statistic. Only meaningful during the training phase.

**RETURN** DATSET(NumericField), one record per Beta coefficient per dependent variable per work-item. The 'id' field is the coefficient number, with 1 being the Y intercept, 2 being the coefficient for the first feature, etc. The number field indicates the dependent variable and corresponds to the number field of the dependent (Y) variable to which it applies.

#### RECORD ConfintRec

OLS \

ConfintRec				
------------	--	--	--	--

#### **FUNCTION** Confint

OLS \

#### ConfInt

(Types.t fieldReal level)

Confidence Interval The Confidence Interval determines the upper and lower bounds of each estimated coefficient given a confidence level (level) that is required. For example, one could say that there is a 95% probability (level) that the coefficient of the first independent variable is between 2.05 and 3.62. This allows error margins to be determined with the desired confidence level. If the confidence interval spans zero, it implies that the coefficient may not be significant at the specified confidence level.

**PARAMETER** <u>level</u> The level of confidence required, expressed as a percentage from 0.0 to 100.0

**RETURN** DATASET(ConfintRec) with one record per coefficient per dependent variable per work-item. The 'id' field is the coefficient number, with 1 being the Y intercept, 2 being the coefficient for the first feature, etc. The number field indicates the dependent variable and corresponds to the number field of the dependent (Y) variable to which it applies.

#### RECORD FTestRec

OLS \

FTestRec

#### **ATTRIBUTE** FTest

OLS \

#### DATASET(FTestRec)

**FTest** 

F-Test Calculate the P-value for the full regression, which is the probability that all of the coefficients are insignificant (i.e. actually zero). A low P-value (e.g. .05) provides evidence that at least one coefficient is significant. A high P-value indicates that all the coefficient values should in fact be zero, implying that the regression has no statistically significant predictive power. P-value is related to the ANOVA F-Statistic, and can be thought of as a standardized version of the ANOVA F-Statistic. The F-Test and T-Test are similar, except that the T-test is used to test the significance of each coefficient, while the F-Test is used to test the significance of the entire regression. For simple linear regression (i.e. only one independent variable, the T-Test and F-Test are equivalent.

**RETURN** DATASET(FTestRec), one record per dependent variable per work-item. The number field indicates the dependent variable and corresponds to the number field of the dependent (Y) variable to which it applies.

### LogisticRegression

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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 matrix

#### BinomialLogisticRegression.ecl

Binomial logistic regression using iteratively re-weighted least squares

#### Confusion.ecl

Detail confusion records to compare actual versus predicted response variable values

#### Constants.ecl

#### DataStats.ecl

Information about the datasets

#### Deviance\_Analysis.ecl

Compare deviance information for an analysis of deviance

#### Deviance Detail.ecl

Detail deviance for each observation

#### dimm.ecl

Matrix multiply when either A or B is a diagonal and is passed as a vector

#### Distributions.ecl

#### ExtractBeta.ecl

Extract the beta values form the model dataset ExtractBeta\_CI.ecl Extract the beta values form the model dataset ExtractBeta\_pval.ecl Extract the beta values form the model dataset ExtractReport.ecl Extract Report records from model LogitPredict.ecl Predict the category values with the logit function and the supplied beta coefficients LogitScore.ecl Calculate the score using the logit function and the supplied beta coefficients Model Deviance.ecl Model Deviance Null Deviance.ecl Deviance for the null model, that is, a model with only an intercept Types.ecl **IRLS** performance Tests validation

#### LogisticRegression/

### BinomialConfusion

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### **IMPORTS**

ML\_Core.Types | LogisticRegression | LogisticRegression.Types |

### **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

#### LogisticRegression/

### ${\bf Binomial Logistic Regression}$

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#### **IMPORTS**

LogisticRegression | LogisticRegression.Constants | ML\_Core.Interfaces | ML\_Core.Types |

#### **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 <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 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) GetModel

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

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 \

```
DATASET(Types.Classify_Result) Classify

(DATASET(Types.Layout_Model) model,
DATASET(Types.NumericField) new_observations)
```

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



### **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

#### LogisticRegression/

### Confusion

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### **IMPORTS**

ML\_Core | ML\_Core.Types | LogisticRegression | LogisticRegression.Types |

### **DESCRIPTIONS**

### **FUNCTION** Confusion

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

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.

### LogisticRegression/

### **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

16. base_epsilon	
17. base_ind_vars	
18. base_dep_vars	
19. base_obs	
20. builder_irls_local	
21. builder_irls_global	
22. builder_softmax	
ATTRIBUTE limit_card	
$Constants \setminus$	
UNSIGNED2 limit_card	
ONDIGNEDZ   IIIIIt_card	
ATTRIBUTE default_epsilon	
$Constants \setminus$	
REAL8 default_epsilon	
ATTRIBUTE default_ridge	

Constants  $\setminus$ 

REAL8 default\_ridge

# ATTRIBUTE local\_cap Constants \ UNSIGNED4 local\_cap ATTRIBUTE id\_base Constants \ id\_base ATTRIBUTE id\_iters Constants $\setminus$ $id\_iters$ ATTRIBUTE id\_delta

# id\_delta

Constants \

## ATTRIBUTE id\_correct

Constants \

id_correct	
ATTRIBUTE id_incorrect	
Constants \	
id_incorrect	
ATTRIBUTE id_stat_set	
Constants \	
id_stat_set	
ATTRIBUTE id_betas	
Constants \	
id_betas	
ATTRIBUTE id_betas_coef	
5546666.	
Constants \	
id_betas_coef	

# ATTRIBUTE id\_betas\_SE Constants \ $id\_betas\_SE$ **ATTRIBUTE** base\_builder Constants \ base\_builder **ATTRIBUTE** base\_max\_iter Constants \ base\_max\_iter **ATTRIBUTE** base\_epsilon Constants \ base\_epsilon

# ATTRIBUTE base\_ind\_vars

Constants \

base_ind_vars	
	_
ATTRIBUTE base_dep_vars	
Substitution of the substi	
Constants \	
	_
base_dep_vars	
	_
ATTRIBUTE base_obs	
Constants \	
base_obs	
	_
ATTRIBUTE builder_irls_local	
Constants \	
builder_irls_local	
	_
ATTRIBUTE builder_irls_global	
Constants	
Constants \	
builder_irls_global	

# **ATTRIBUTE** builder\_softmax

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$\mathbf{\circ}$	$\mathbf{o}_{\mathbf{I}}$	$\mathbf{r}$	υcu.	ш	JID.	

builder\_softmax

## **DataStats**

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#### **IMPORTS**

ML\_Core.Types | LogisticRegression | LogisticRegression.Types | LogisticRegression.Constants |

#### **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

Go Up

#### **IMPORTS**

LogisticRegression | LogisticRegression. 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 <u>base</u> the base model for comparison

**RETURN** the comparison of the deviance between the models

# Deviance\_Detail

Go Up

#### **IMPORTS**

ML\_Core | ML\_Core.Types | LogisticRegression | LogisticRegression.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.

## dimm

Go Up

#### **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 <u>n</u> number of columns in product

**PARAMETER** <u>k</u> 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

**PARAMETER** <u>C</u> matrix C or empty

## **Distributions**

Go Up

#### **IMPORTS**

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 <u>x</u> 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 <u>x</u> value of the evaluation

PARAMETER <u>df</u> 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.

## ExtractBeta

Go Up

#### **IMPORTS**

ML\_Core.Types | LogisticRegression | LogisticRegression.Types |

### **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.

# ExtractBeta\_CI

Go Up

#### **IMPORTS**

ML\_Core.Types | LogisticRegression | LogisticRegression.Types |

#### **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.

# ExtractBeta\_pval

Go Up

### **IMPORTS**

ML\_Core.Types | LogisticRegression | LogisticRegression.Types |

### **DESCRIPTIONS**

### FUNCTION ExtractBeta\_pval

DATASET(Types.pval_Model_Coef)	ExtractBeta_pval
(DATASET(Core_Types.Layout_Mode	1) 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**

Go Up

#### **IMPORTS**

ML\_Core.Types | LogisticRegression | LogisticRegression.Types | LogisticRegression.Constants |

### **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

Go Up

#### **IMPORTS**

ML\_Core.Types | LogisticRegression | LogisticRegression.Types |

#### **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 <u>coef</u> the model beta coefficients

PARAMETER independents the observations

**RETURN** the predicted category values and a confidence score

# LogitScore

Go Up

#### **IMPORTS**

ML\_Core.Types | LogisticRegression | LogisticRegression.Types |

#### **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

Go Up

#### **IMPORTS**

LogisticRegression | LogisticRegression. Types |

#### **DESCRIPTIONS**

## **FUNCTION** Model\_Deviance

DATASET(Types.Deviance\_Record) Model\_Deviance

(DATASET(Types.Observation\_Deviance) od,
DATASET(Types.Model\_Coef) mod)

Model Deviance.

PARAMETER od observation deviance record

PARAMETER <u>mod</u> model co-efficients

**RETURN** model deviance

# $\frac{{\bf Logistic Regression}/}{{\bf Null\_Deviance}}$

Go Up

### **IMPORTS**

LogisticRegression | LogisticRegression. Types |

### **DESCRIPTIONS**

## **FUNCTION** Null\_Deviance

DATASET(Types.Deviance_Record)	Null_Deviance
(DATASET(Types.Observation_Devi	ance) od)

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

PARAMETER <u>od</u> Observation Deviance record set.

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

# **Types**

Go Up

## **IMPORTS**

ML\_Core.Types |

## **DESCRIPTIONS**

## **MODULE** Types

Types

#### Children

- 1. t\_Universe
- 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	
12. pval_Model_Coef	
13. Raw_Prediction	
14. Observation_Deviance	
15. Deviance_Record	
16. AOD_Record	
ATTRIBUTE t_Universe	
Types \	
t_Universe	
RECORD Field_Desc	
Types \	
Field_Desc	
RECORD Data_Info	
Types \	
Data_Info	

RECORD NumericField_U
Types \
NumericField_U
RECORD DiscreteField_U
Types \
DiscreteField_U
RECORD Layout_Column_Map
$\mathrm{Types} \setminus$
Layout_Column_Map
Layout_Column_Map
Layout_Column_Map
Layout_Column_Map  RECORD Classifier_Stats
RECORD Classifier_Stats
RECORD Classifier_Stats  Types \
RECORD Classifier_Stats  Types \
RECORD Classifier_Stats  Types \

Model_Report
RECORD Binomial_Confusion_Summary
Types \
Binomial_Confusion_Summary
RECORD Model_Coef
NECOND Widdei_Coci
Types \
Madal Cast
Model_Coef
RECORD Confidence_Model_Coef
Types \
Confidence_Model_Coef
RECORD pval_Model_Coef
Types \
pval_Model_Coef

RECORD Raw_Prediction
Types \
Raw_Prediction
RECORD Observation_Deviance
$\mathrm{Types} \setminus$
Observation_Deviance
RECORD Deviance_Record
Types \
Deviance_Record
RECORD AOD_Record
Types \
AOD_Record

## **IRLS**

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#### **Table of Contents**

#### GetModel.ecl

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

#### LogisticRegression/ IRLS/

## **GetModel**

Go Up

#### **IMPORTS**

ML\_Core | ML\_Core.Types | LogisticRegression | LogisticRegression.Constants | LogisticRegression.Types | LogisticRegression.IRLS |

#### **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 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 stats

#### LogisticRegression/ IRLS/

# $GetModel\_global$

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#### **IMPORTS**

ML\_Core | ML\_Core.Types | PBblas | PBblas.Types | LogisticRegression | LogisticRegression.Constants | LogisticRegression.Types |

#### **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.

#### LogisticRegression/ IRLS/

## $\mathbf{GetModel\_local}$

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#### **IMPORTS**

ML\_Core | ML\_Core.Types | LogisticRegression | LogisticRegression.Constants | LogisticRegression.Types | LogisticRegression.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.



# performance

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RunBinomial.ecl

## LogisticRegression/ performance/

# RunBinomial

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## **IMPORTS**

LogisticRegression | ML\_Core.Types |

## **DESCRIPTIONS**

## **ATTRIBUTE** RunBinomial

RunBinomial

# Tests

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## **Table of Contents**

 $Check\_Dist.ecl$ 

# $\begin{array}{c} {\bf Logistic Regression/\ Tests/} \\ {\bf Check\_Dist} \end{array}$

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## **IMPORTS**

LogisticRegression.Distributions | ML\_Core | python |

## **DESCRIPTIONS**

## ATTRIBUTE Check\_Dist

Check\_Dist

# validation

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## **Table of Contents**

BinomialRegression.ecl
discrete_GermanDS.ecl
IrisDS.ecl
unit_test_dimm.ecl

## LogisticRegression/ validation/

# BinomialRegression

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## **IMPORTS**

LogisticRegression.validation | LogisticRegression | ML\_Core.Types | ML\_Core | LogisticRegression.Types |

## **DESCRIPTIONS**

## **ATTRIBUTE** BinomialRegression

BinomialRegression

## ${\bf Logistic Regression/\ validation/}$

# ${\bf discrete\_GermanDS}$

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<u>IMPORTS</u>			
ML_Core.Types			
<b>DESCRIPTIONS</b>			
MODULE discrete_Gerr	manDS		
discrete_GermanDS			
Children			
1. content			
ATTRIBUTE content			
discrete_GermanDS \			
content			

## ${\bf Logistic Regression/\ validation/}$

# **IrisDS**

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## **IMPORTS**

ML\_Core | ML\_Core.Types |

## **DESCRIPTIONS**

## **ATTRIBUTE** irisDS

irisDS

# $\begin{array}{c} {\rm LogisticRegression/\ validation/} \\ {unit\_test\_dimm} \end{array}$

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## **IMPORTS**

LogisticRegression | std.BLAS.Types |

## **DESCRIPTIONS**

ATTRIBUTE unit\_test\_dimm

 $unit\_test\_dimm$ 

# ML\_Core

## Go Up

Name	ML_Core
Version	3.1.0
Description	Common definitions for Machine Learning
License	SeeLICENSE.TXT
Copyright	Copyright (C) 2017 HPCC Systems
Authors	HPCCSystems
Platform	6.2.0

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AppendSeqID.ecl
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# $\begin{array}{c} {\rm ML\_Core/} \\ {\bf AppendID} \end{array}$

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## **DESCRIPTIONS**

## MACRO AppendID

	AppendID
(	(dIn,idfield,dOut)

# ${\bf AppendSeqID}$

Go Up

## **DESCRIPTIONS**

## MACRO AppendSeqID

AppendSeqID

(dIn,idfield,dOut)

# $\frac{\mathrm{ML\_Core}}{Config}$

Go Up

## **DESCRIPTIONS**

## **MODULE** Config

Config

### Children

- 1. MaxLookup
- 2. Discrete
- 3. RoundingError

## **ATTRIBUTE** MaxLookup

Config \

MaxLookup

## **ATTRIBUTE** Discrete

Config \

Discrete

# **ATTRIBUTE** RoundingError

Config \

 ${\bf Rounding Error}$ 

# ML\_Core/ Constants

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## **DESCRIPTIONS**

## **MODULE** Constants

Constants

Useful constants

#### Children

- 1. Pi: Constant PI
- 2. Root\_2 : Constant square root of 2

## **ATTRIBUTE** Pi

Constants \

 $\mathbf{Pi}$ 

Constant PI

# ATTRIBUTE Root\_2

Constants \

Constant square root of 2

# $\frac{\text{ML\_Core}/}{\textbf{FieldAggregates}}$

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## **IMPORTS**

 $\operatorname{ML\_Core} \mid \operatorname{ML\_Core}.\operatorname{Types} \mid \operatorname{ML\_Core}.\operatorname{Utils} \mid \operatorname{std.system}.\operatorname{ThorLib} \mid$ 

## **DESCRIPTIONS**

## **MODULE** FieldAggregates

FieldAggregates

(DATASET(Types.NumericField) d)

#### Children

- 1. Simple
- 2. SimpleRanked
- 3. Medians
- 4. MinMedNext
- 5. Buckets
- 6. BucketRanges
- 7. Modes
- 8. Cardinality
- 9. RankedInput

10. NTiles	
11. NTileRanges	
ATTRIBUTE Simple	
FieldAggregates \	
Simple	
ATTRIBUTE Circula Danked	
ATTRIBUTE SimpleRanked	
FieldAggregates \	
SimpleRanked	
ATTRIBUTE Medians	
FieldAggregates \	
Medians	
ATTRIBUTE MinMedNext	
FieldAggregates \	
MinMedNext	

## **FUNCTION** Buckets

Field	Aggregates \
В	uckets
(Тур	pes.t_Discrete n)
FUN	ICTION BucketRanges
Field	$ar{ ext{Aggregates}}$
В	$\operatorname{ucketRanges}$
(Тур	pes.t_Discrete n)
ATT	TRIBUTE Modes
Field	Aggregates \
M	lodes
<b>AT</b> 7	TRIBUTE Cardinality
Field	$oxed{Aggregates} \setminus$
$oxed{\mathbf{C}}$	ardinality

## **ATTRIBUTE** RankedInput

FieldAggregates \

 ${\bf Ranked Input}$ 

## **FUNCTION NTiles**

FieldAggregates \

NTiles

(Types.t\_Discrete n)

## **FUNCTION** NTileRanges

FieldAggregates \

NTileRanges

(Types.t\_Discrete n)

# $\begin{array}{c} \text{ML\_Core/} \\ \textbf{FromField} \end{array}$

 ${\rm Go}\ {\rm Up}$ 

## **DESCRIPTIONS**

## MACRO FromField

FromField

(dIn,10ut,dOut,dMap=")

# $egin{array}{c} ext{ML\_Core/} \ ext{Generate} \end{array}$

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## **IMPORTS**

ML\_Core | ML\_Core.Types |

## **DESCRIPTIONS**

## **MODULE** Generate

Generate

#### Children

- 1. tp\_Method
- 2. MethodName
- 3. ToPoly

## ATTRIBUTE tp\_Method

Generate \

 $tp\_Method$ 

## **FUNCTION** MethodName

## Generate $\setminus$

MethodName

(tp\_Method x)

## **FUNCTION** ToPoly

### $Generate \ \backslash$

ToPoly

(DATASET(Types.NumericField) seedCol, UNSIGNED maxN=6)

# $\begin{array}{c} \text{ML\_Core/} \\ \textbf{ToField} \end{array}$

 ${\rm Go}\ {\rm Up}$ 

## **DESCRIPTIONS**

## MACRO ToField

ToField

(dIn,dOut,idfield=", wifield=", wivalue=",datafields=")

# $rac{ ext{ML\_Core}}{ ext{Types}}$

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## **DESCRIPTIONS**

## **MODULE** Types

Types

#### Children

- 1. t\_RecordID
- $2. \ t\_FieldNumber$
- $3. t_FieldReal$
- 4. t\_FieldSign
- 5. t\_Discrete
- 6. t\_Item
- 7. t\_Count
- 8. t\_Work\_Item
- 9. AnyField
- 10. NumericField
- 11. DiscreteField
- 12. Layout\_Model
- 13. Classify\_Result
- 14. l\_result
- 15. Confusion\_Detail

17. t_node
18. t_level
19. NodeID
ATTRIBUTE t_RecordID
Types \
t_RecordID
ATTRIBUTE t_FieldNumber
ATTRIBUTE t_FieldNumber
Types \
${f t}_{f FieldNumber}$
ATTRIBUTE t_FieldReal
Types \
t_FieldReal
ATTRIBUTE t_FieldSign
Types \

16. ItemElement

t_FieldSign
ATTRIBUTE t_Discrete
Types \
t_Discrete
ATTRIBUTE t_Item
Types \
t_Item
ATTRIBUTE t_Count
Types \
t_Count
ATTRIBUTE t_Work_Item
Types \
t_Work_Item

RECORD AnyField
Types \
AnyField
RECORD NumericField
$\mathrm{Types} \setminus$
NumericField
RECORD DiscreteField
Types \
DiscreteField
RECORD Layout_Model
Types \
Layout_Model
RECORD Classify_Result
Types \

Classify_Result
RECORD I_result
Types \
l_result
RECORD Confusion_Detail
Types \
Confusion_Detail
RECORD ItemElement
Types \
ItemElement
ItemBiement
ATTRIBUTE t_node
Types \
t_node

# ATTRIBUTE t\_level

Types \			
t_level			
RECORD Not	deID		
Types \			
NodeID			

## Interfaces

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## **Table of Contents**

### IClassify.ecl

Interface definition for Classification

### IRegression.ecl

Interface Definition for Regression Modules Regression learns a function that maps a set of input data to one or more output variables

# ML\_Core/ Interfaces/ IClassify

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## **IMPORTS**

ML\_Core | ML\_Core.Types |

### **DESCRIPTIONS**

## **MODULE** IClassify

**IClassify** 

Interface definition for Classification. Actual implementation modules will probably take parameters.

#### 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

IClassify \

# DATASET(Types.Layout\_Model) GetModel (DATASET(Types.NumericField) observations, DATASET(Types.DiscreteField) classifications)

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

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

PARAMETER classifications the observed classification used to build the model

**RETURN** the encoded model

## **FUNCTION** Classify

IClassify \

```
DATASET(Types.Classify_Result) Classify

(DATASET(Types.Layout_Model) model,
DATASET(Types.NumericField) new_observations)
```

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

### **FUNCTION** Report

IClassify \

```
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 classifications the classifications associated with the observations

**RETURN** the confusion matrix showing correct and incorrect results

### ML\_Core/ Interfaces/

# **IRegression**

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### **IMPORTS**

ML\_Core | ML\_Core.Types |

### **DESCRIPTIONS**

## **MODULE** IRegression

#### **IRegression**

(DATASET(NumericField) X=empty data, DATASET(NumericField) Y=empty data)

Interface Definition for Regression Modules Regression learns a function that maps a set of input data to one or more output variables. The resulting learned function is known as the model. That model can then be used repetitively to predict (i.e. estimate) the output value(s) based on new input data.

**PARAMETER** X The independent data in DATASET(NumericField) format. Each statistical unit (e.g. record) is identified by 'id', and each feature is identified by field number (i.e. 'number').

**PARAMETER** Y The dependent variable(s) in DATASET(NumericField) format. Each statistical unit (e.g. record) is identified by 'id', and each feature is identified by field number (i.e. 'number').

#### Children

- 1. GetModel: Calculate and return the 'learned' model The model may be persisted and later used to make predictions using 'Predict' below
- 2. Predict: Predict the output variable(s) based on a previously learned model

### **ATTRIBUTE** GetModel

IRegression \

DATASET(Layout\_Model) GetModel

Calculate and return the 'learned' model The model may be persisted and later used to make predictions using 'Predict' below.

**RETURN** DATASET(LayoutModel) describing the learned model parameters

### **FUNCTION** Predict

IRegression \

DATASET(NumericField) Predict

(DATASET(NumericField) newX, DATASET(Layout\_Model) model)

Predict the output variable(s) based on a previously learned model

PARAMETER <u>newX</u> DATASET(NumericField) containing the X values to b predicted.

**RETURN** DATASET(NumericField) containing one entry per observation (i.e. id) in newX. This represents the predicted values for Y.

## Math

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### Table of Contents

#### Beta.ecl

Return the beta value of two positive real numbers, x and y

#### Distributions.ecl

#### DoubleFac.ecl

The 'double' factorial is defined for ODD n and is the product of all the odd numbers up to and including that number

#### Fac.ecl

Factorial function

#### gamma.ecl

Return the value of gamma function of real number x A wrapper for the standard C tgamma function

#### log\_gamma.ecl

Return the value of the log gamma function of the absolute value of X

#### lowerGamma.ecl

Return the lower incomplete gamma value of two real numbers,

#### NCK.ecl

#### Poly.ecl

Evaluate a polynomial from a set of co-effs

#### StirlingFormula.ecl

Stirling's formula

#### upperGamma.ecl

Return the upper incomplete gamma value of two real numbers, x and y

# $\begin{array}{c} \mathrm{ML\_Core/\ Math/} \\ Beta \end{array}$

Go Up

## **IMPORTS**

ML\_Core.Math |

## **DESCRIPTIONS**

## **FUNCTION** Beta

Beta

(REAL8 x, REAL8 y)

Return the beta value of two positive real numbers, **x** and **y** 

**PARAMETER**  $\underline{\mathbf{x}}$  the value of the first number

**PARAMETER**  $\underline{\mathbf{y}}$  the value of the second number

**RETURN** the beta value

# $\begin{array}{c} \text{ML\_Core/ Math/} \\ \textbf{Distributions} \end{array}$

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### **IMPORTS**

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 <u>x</u> 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

 $\begin{array}{c} \textbf{PARAMETER} & \underline{\mathbf{x}} \text{ value of the evaluation} \\ \\ \textbf{PARAMETER} & \underline{\mathbf{df}} \text{ degrees of freedom} \\ \end{array}$ 

### 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.

# ML\_Core/ Math/ DoubleFac

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### **DESCRIPTIONS**

## **EMBED** DoubleFac

REAL8	DoubleFac
(INTEGER2 i)	

The 'double' factorial is defined for ODD n and is the product of all the odd numbers up to and including that number. We are extending the meaning to even numbers to mean the product of the even numbers up to and including that number. Thus DoubleFac(8) = 8\*6\*4\*2 We also defend against i < 2 (returning 1.0)

PARAMETER i the value used in the calculation

**RETURN** the factorial of the sequence, declining by 2

# $\frac{\mathrm{ML\_Core}/\ \mathrm{Math}/}{Fac}$

Go Up

## **DESCRIPTIONS**

## EMBED Fac

REAL8	Fac
(UNSIGNED2 i)	

Factorial function

**PARAMETER**  $\underline{\mathbf{i}}$  the value used,  $(\mathbf{i})(\mathbf{i}\text{-}1)(\mathbf{i}\text{-}2)\dots(2)$ 

**RETURN** the factorial i!

# $\frac{\mathrm{ML\_Core/\ Math/}}{gamma}$

Go Up

## **DESCRIPTIONS**

## **EMBED** gamma

REAL8	gamma
(REAL8 x)	

Return the value of gamma function of real number x A wrapper for the standard C tgamma function.

**PARAMETER**  $\underline{\mathbf{x}}$  the input x

**RETURN** the value of GAMMA evaluated at x

# $\frac{\mathrm{ML\_Core/\ Math/}}{log\_gamma}$

Go Up

## **DESCRIPTIONS**

## EMBED log\_gamma

REAL8	log_gamma
(REAL8 x)	

Return the value of the log gamma function of the absolute value of X. A wrapper for the standard C lgamma function. Avoids the race condition found on some platforms by taking the absolute value of the of the input argument.

**PARAMETER**  $\underline{\mathbf{x}}$  the input  $\mathbf{x}$ 

**RETURN** the value of the log of the GAMMA evaluated at ABS(x)

# $\frac{\mathrm{ML\_Core/\ Math/}}{lowerGamma}$

Go Up

## **DESCRIPTIONS**

## **EMBED** lowerGamma

REAL8	lowerGamma
(REAL8	x, REAL8 y)

Return the lower incomplete gamma value of two real numbers, x and y

**PARAMETER**  $\underline{\mathbf{x}}$  the value of the first number

**PARAMETER** y the value of the second number

**RETURN** the lower incomplete gamma value

# $\frac{\mathrm{ML\_Core}/\ \mathrm{Math}/}{\mathrm{NCK}}$

Go Up

## **IMPORTS**

 $\operatorname{ML\_Core.Math} \mid$ 

## **DESCRIPTIONS**

## **FUNCTION NCK**

REAL8 NCK

(INTEGER2 N, INTEGER2 K)

# ML\_Core/ Math/ Poly

Go Up

## **DESCRIPTIONS**

## **EMBED** Poly

REAL8	Poly
(REAL8 x, SET OF REAL8 Coeffs)	

Evaluate a polynomial from a set of co-effs. Co-effs 1 is assumed to be the HIGH order of the equation. Thus for  $ax^2+bx+c$  - the set would need to be Coef := [a,b,c];

**PARAMETER**  $\underline{\mathbf{x}}$  the value of x in the polynomial

PARAMETER Coeffs a set of coefficients for the polynomial. The ALL set is considered to be all zero values

**RETURN** value of the polynomial at x

# $\begin{array}{c} {\rm ML\_Core/\ Math/} \\ {\bf StirlingFormula} \end{array}$

Go Up

## **IMPORTS**

ML\_Core.Math | ML\_Core.Constants |

## **DESCRIPTIONS**

## **FUNCTION** StirlingFormula

StirlingFormula

(REAL x)

Stirling's formula

**PARAMETER**  $\underline{\mathbf{x}}$  the point of evaluation

**RETURN** evaluation result

# $\begin{array}{c} {\rm ML\_Core/\ Math/} \\ upperGamma \end{array}$

Go Up

## **DESCRIPTIONS**

## EMBED upperGamma

REAL8	upperGamma
(REAL8 x, REAL8 y)	

Return the upper incomplete gamma value of two real numbers,  ${\bf x}$  and  ${\bf y}$ .

**PARAMETER**  $\underline{\mathbf{x}}$  the value of the first number

**PARAMETER** y the value of the second number

**RETURN** the upper incomplete gamma value

# Tests

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## **Table of Contents**

Check_Dist.ecl
field_aggregates.ecl
generate.ecl
test_appends.ecl
test_discrete.ecl
to_from.ecl
Validate_Betas.ecl
Validate_Gammas.ecl



Go Up

## **IMPORTS**

ML\_Core.Math.Distributions | ML\_Core | python |

## **DESCRIPTIONS**

## ATTRIBUTE Check\_Dist

Check\_Dist

# $\begin{array}{c} {\rm ML\_Core/\ Tests/} \\ \\ field\_aggregates \end{array}$

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## **IMPORTS**

ML\_Core | ML\_Core.Types |

## **DESCRIPTIONS**

# **ATTRIBUTE** field\_aggregates

 $field\_aggregates$ 

# ML\_Core/ Tests/ generate

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## **IMPORTS**

ML\_Core |

## **DESCRIPTIONS**

## **ATTRIBUTE** generate

generate

# $\begin{array}{c} {\rm ML\_Core/\ Tests/} \\ test\_appends \end{array}$

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## **IMPORTS**

ML\_Core | std.system.thorlib |

## **DESCRIPTIONS**

## **ATTRIBUTE** test\_appends

 $test\_appends$ 

# $\begin{array}{c} \text{ML\_Core/ Tests/} \\ \textbf{test\_\_discrete} \end{array}$

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## **IMPORTS**

ML\_Core | ML\_Core.Types |

## **DESCRIPTIONS**

## ATTRIBUTE test\_discrete

test\_discrete

$$\frac{\mathrm{ML\_Core/\ Tests/}}{to\_from}$$

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## **IMPORTS**

ML\_Core | ML\_Core.Types |

## **DESCRIPTIONS**

# ATTRIBUTE to\_from

to\_from

# $\begin{array}{c} {\rm ML\_Core/\ Tests/} \\ {\bf Validate\_Betas} \end{array}$

Go Up

## **IMPORTS**

ML\_Core | ML\_Core.Math | python |

## **DESCRIPTIONS**

## **ATTRIBUTE** Validate\_Betas

Validate\_Betas

# $\begin{array}{c} {\rm ML\_Core/\ Tests/} \\ {\bf Validate\_Gammas} \end{array}$

Go Up

## **IMPORTS**

ML\_Core | ML\_Core.Math | python |

## **DESCRIPTIONS**

## **ATTRIBUTE** Validate\_Gammas

Validate\_Gammas

# Utils

#### Go Up

### **Table of Contents**

#### Fat.ecl

Will take a potentially sparse file d and fill in the missing

#### FatD.ecl

Will take a potentially sparse file d and fill in the missing

#### Gini.ecl

Creates a file of pivot/target pairs with a Gini impurity value

#### SequenceInField.ecl

Given a file which is sorted by the work item identifier and INFIELD (and possibly other values), add sequence numbers within the range of each infield

# ML\_Core/ Utils/ Fat

Go Up

## **IMPORTS**

ML\_Core.Types |

### **DESCRIPTIONS**

## **FUNCTION** Fat

DATASET(Types.NumericField)	Fat
(DATASET(Types.NumericField) d0, Types.t_FieldReal v=0)	

Will take a potentially sparse file d and fill in the missing with value v for Numeric Field datasets

PARAMETER <u>d0</u> They myriad format Numeric Field dataset to be filled

**PARAMETER**  $\underline{\mathbf{v}}$  The value to assign missing records

**RETURN** A full Numeric Field dataset with every field populated

# ML\_Core/ Utils/ FatD

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## **IMPORTS**

ML\_Core.Types |

### **DESCRIPTIONS**

## **FUNCTION** FatD

DATASET(Types.DiscreteField)	FatD
(DATASET(Types.DiscreteField)	d0, Types.t_Discrete v=0)

Will take a potentially sparse file d and fill in the missing with value v for Discrete Field datasets

PARAMETER <u>d0</u> They myriad format Discrete Field dataset to be filled

**PARAMETER**  $\underline{\mathbf{v}}$  The value to assign missing records

**RETURN** A full Discrete Field dataset with every field populated

# ML\_Core/ Utils/ Gini

Go Up

### **DESCRIPTIONS**

### **MACRO** Gini

Gini
(infile, pivot, target, wi\_name='wi')

Creates a file of pivot/target pairs with a Gini impurity value.

PARAMETER infile the input file, any type with a work item field

PARAMETER pivot the name of the pivot field

PARAMETER target the name of the field used as the target

PARAMETER wi\_name the name of the work item field, default is "wi" return A table by Work Item and Pivot value giving count and Gini impurity value

# $\begin{array}{c} {\rm ML\_Core/\ Utils/} \\ {\bf SequenceInField} \end{array}$

Go Up

### **DESCRIPTIONS**

### MACRO SequenceInField

#### SequenceInField

(infile,infield,seq,wi\_name='wi')

Given a file which is sorted by the work item identifier and INFIELD (and possibly other values), add sequence numbers within the range of each infield. Slighly elaborate code is to avoid having to partition the data to one value of infield per node and to work with very large numbers of records where a global count project would be inappropriate. This is useful for assigning rank positions with the groupings.

PARAMETER <u>infile</u> the input file, any type

PARAMETER <u>infield</u> field name of grouping field

PARAMETER seq name of the field to receive the sequence number

PARAMETER wi\_name work item field name, default is wi

**RETURN** a file of the same type with sequence numbers applied

## **PBblas**

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Name	PBblas
Version	3.0.1
Description	Parallel Block Basic Linear Algebra Subsystem
License	http://www.apache.org/licenses/LICENSE-2.0
Copyright	Copyright (C) 2016, 2017 HPCC Systems
Authors	HPCCSystems
DependsOn	ML_Core
Platform	6.2.0

#### Table of Contents

#### Apply2Elements.ecl

Apply a function to each element of the matrix Use PBblas. IElementFunc as the prototype function

#### asum.ecl

Absolute sum – the "Entrywise" 1-norm

#### axpy.ecl

Implements alpha\*X + Y

#### Constants.ecl

#### Converted.ecl

Module to convert between ML\_Core/Types Field layouts (i.e

#### ExtractTri.ecl

Extract the upper or lower triangle from the composite output from getrf (LU Factorization)

#### gemm.ecl

Extended Parallel Block Matrix Multiplication Module Implements: Result = alpha \* op(A)op(B) + beta \* C

#### getrf.ecl

LU Factorization Splits a matrix into Lower and Upper triangular factors Produces composite LU matrix for the diagonal blocks

#### HadamardProduct.ecl

Element-wise multiplication of X \* Y

#### IElementFunc.ecl

Function prototype for a function to apply to each element of the

#### MatUtils.ecl

Provides various utility attributes for manipulating cell-based matrixes

#### potrf.ecl

Implements Cholesky factorization of A = U\*\*T \* U if Triangular. Upper requested or A = L \* L\*\*T if Triangular. Lower is requested

#### scal.ecl

Scale a matrix by a constant Result is alpha \* X This supports a "myriad" style interface in that X may be a set of independent matrices separated by different work-item ids

#### tran.ecl

Transpose a matrix and sum into base matrix

#### trsm.ecl

Partitioned block parallel triangular matrix solver

#### Types.ecl

Types for the Parallel Block Basic Linear Algebra Sub-programs support WARNING: attributes marked with WARNING can not be changed without making corresponding changes to the C++ attributes

#### Vector2Diag.ecl

Convert a vector into a diagonal matrix

# PBblas/ Apply2Elements

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### **IMPORTS**

PBblas | PBblas.Types | std.blas |

### **DESCRIPTIONS**

## **FUNCTION** Apply2Elements

DATASET(Layout_Cell)	Apply2Elements
(DATASET(Layout_Cell)	X, IElementFunc f)

Apply a function to each element of the matrix Use PBblas.IElementFunc as the prototype function. Input and ouput may be a single matrix, or myriad matrixes with different work item ids.

**PARAMETER** X A matrix (or multiple matrices) in Layout\_Cell form

**PARAMETER**  $\underline{\mathbf{f}}$  A function based on the IElementFunc prototype

**RETURN** A matrix (or multiple matrices) in Layout\_Cell form

SEE PBblas/IElementFunc

SEE PBblas/Types.Layout\_Cell

### PBblas/

### asum

Go Up

## **IMPORTS**

PBblas.Types | PBblas.internal | PBblas.internal.Types | PBblas.internal.MatDims | PBblas.internal.Converted | std.blas |

## **DESCRIPTIONS**

## **FUNCTION** asum

DATASET(Layout_Norm)	asum
(DATASET(Layout_Cell)	X)

Absolute sum – the "Entrywise" 1-norm Compute SUM(ABS(X))

**PARAMETER** X Matrix or set of matrices in Layout\_Cell format

**RETURN** DATASET(Layout\_Norm) with one record per work item

SEE PBblas/Types.Layout\_Cell

# PBblas/ axpy

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### **IMPORTS**

PBblas | PBblas.Types |

### **DESCRIPTIONS**

## **FUNCTION** axpy

```
DATASET(Layout_Cell) axpy
(value_t alpha, DATASET(Layout_Cell) X, DATASET(Layout_Cell) Y)
```

Implements alpha\*X + Y X and Y must have same shape

PARAMETER alpha Scalar multiplier for the X matrix

PARAMETER X X matrix in DATASET(Layout\_Cell) form

PARAMETER Y matrix in DATASET(Layout\_Call) form

**RETURN** Matrix in DATASET(Layout\_Cell) form

SEE PBblas/Types.layout\_cell

## PBblas/

## **Constants**

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## **DESCRIPTIONS**

### **MODULE** Constants

Constants

#### Children

- 1. Block\_Minimum
- 2. Block\_NoSplit
- 3. Block\_Maximum
- 4. Block\_Vec\_Rows
- 5. Dimension\_Incompat
- 6. Dimension\_IncompatZ
- 7. Distribution\_Error
- 8. Distribution\_ErrorZ
- 9. Not\_Square
- $10. \ \ Not\_SquareZ$
- 11. Not\_PositiveDef
- 12. Not\_PositiveDefZ
- 13. Not\_Single\_Block
- 14. Not\_Single\_BlockZ
- 15. Not\_Block\_Vector

ATTRIBUTE Block_Minimum	
Constants \	
Block_Minimum	
ATTRIBUTE Block_NoSplit	
Constants \	
Block_NoSplit	
ATTRIBUTE Block_Maximum	
ATTRIBOTE BIOCK_Waximum	
Constants \	
Block_Maximum	
ATTRIPLITE Plack Voc Pows	
ATTRIBUTE Block_Vec_Rows	
Constants \	
Block Voc Rows	

# **ATTRIBUTE** Dimension\_Incompat Constants \ Dimension\_Incompat ATTRIBUTE Dimension\_IncompatZ Constants \ Dimension\_IncompatZ **ATTRIBUTE** Distribution\_Error Constants \ Distribution\_Error **ATTRIBUTE** Distribution\_ErrorZ Constants \ Distribution ErrorZ **ATTRIBUTE** Not\_Square Constants \

Not_Square
ATTRIBUTE Not_SquareZ
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Not_SquareZ
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ATTRIBUTE Not_PositiveDefZ
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Not_PositiveDefZ
TVOt_1 OSITIVEDEIZ
ATTRIBUTE Not_Single_Block
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Not_Single_Block

# ATTRIBUTE Not\_Single\_BlockZ Constants \ Not\_Single\_BlockZ ATTRIBUTE Not\_Block\_Vector Constants \ $Not\_Block\_Vector$ ATTRIBUTE Not\_Block\_VectorZ Constants \ $Not\_Block\_VectorZ$

# $\begin{array}{c} {\rm PBblas/} \\ {\bf Converted} \end{array}$

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### **IMPORTS**

PBblas | PBblas.Types | ML\_Core.Types |

### **DESCRIPTIONS**

## **MODULE** Converted

#### Converted

Module to convert between ML\_Core/Types Field layouts (i.e. NumericField and DiscreteField) and PBblas matrix layout (i.e. Layout Cell)

#### Children

- 1. NFToMatrix : Convert NumericField dataset to Matrix
- 2. DFToMatrix: Convert DiscreteField dataset to Matrix
- 3. MatrixToNF: Convert Matrix to NumericField dataset
- 4. MatrixToDF: Convert Matrix to DiscreteField dataset

### **FUNCTION NFToMatrix**

#### Converted \

DATASET(Layout_Cell)	NFToMatrix
(DATASET(NumericField	) recs)

Convert NumericField dataset to Matrix

PARAMETER recs Record Dataset in DATASET(NumericField) format

**RETURN** Matrix in DATASET(Layout\_Cell) format

SEE PBblas/Types.Layout\_Cell

SEE ML\_Core/Types.NumericField

### **FUNCTION** DFToMatrix

#### Converted \

DATASET(Layout_Cell)	DFToMatrix
(DATASET(DiscreteField) recs)	

Convert DiscreteField dataset to Matrix

PARAMETER recs Record Dataset in DATASET(DiscreteField) format

RETURN Matrix in DATASET(Layout\_Cell) format

SEE PBblas/Types.Layout\_Cell

SEE ML\_Core/Types.DiscreteField

### **FUNCTION** MatrixToNF

#### Converted \

DATASET(NumericField)	MatrixToNF
(DATASET(Layout Cell) mat)	

Convert Matrix to NumericField dataset

PARAMETER <u>mat</u> Matrix in DATASET(Layout\_Cell) format

**RETURN** NumericField Dataset

SEE PBblas/Types.Layout\_Cell

SEE ML\_Core/Types.NumericField

### **FUNCTION** MatrixToDF

#### Converted \

DATASET(DiscreteField)	MatrixToDF
(DATASET(Layout_Cell) mat)	

Convert Matrix to DiscreteField dataset

PARAMETER <u>mat</u> Matrix in DATASET(Layout\_Cell) format

**RETURN** DiscreteField Dataset

SEE PBblas/Types.Layout\_Cell

SEE ML\_Core/Types.DiscreteField

## PBblas/ ExtractTri

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## **IMPORTS**

PBblas | std.blas | PBblas.Types | PBblas.internal | PBblas.internal.Types | PBblas.internal.MatDims | PBblas.internal.Converted |

## **DESCRIPTIONS**

## FUNCTION ExtractTri

DATASET(Layout_Cell)	ExtractTri
(Triangle tri, Diagonal dt, DATASET(Layout_Cell) A)	

Extract the upper or lower triangle from the composite output from getrf (LU Factorization).

PARAMETER <u>tri</u> Triangle type: Upper or Lower (see Types.Triangle)

PARAMETER dt Diagonal type: Unit or non unit (see Types.Diagonal)

PARAMETER <u>A</u> Matrix of cells. See Types.Layout\_Cell

**RETURN** Matrix of cells in Layout\_Cell format representing a triangular matrix (upper or lower)

SEE Std.PBblas.Types

### PBblas/

## gemm

Go Up

#### **IMPORTS**

PBblas.Types | PBblas.internal | PBblas.internal.Types | std.blas | PBblas.internal.MatDims | std.system.Thorlib |

#### **DESCRIPTIONS**

## **FUNCTION** gemm

```
DATASET(Layout_Cell) gemm

(BOOLEAN transposeA, BOOLEAN transposeB, value_t alpha,
DATASET(Layout_Cell) A_in, DATASET(Layout_Cell) B_in,
DATASET(Layout_Cell) C_in=emptyC, value_t beta=0.0)
```

Extended Parallel Block Matrix Multiplication Module Implements: Result = alpha \* op(A)op(B) + beta \* C. op is No Transpose or Transpose. Multiplies two matrixes A and B, with an optional pre-multiply transpose for each Optionally scales the product by the scalar "alpha". Then adds an optional C matrix to the product after scaling C by the scalar "beta". A, B, and C are specified as DATASET(Layout\_Cell), as is the Resulting matrix. Layout\_Cell describes a sparse matrix stored as a list of x, y, and value. This interface also provides a "Myriad" capability allowing multiple similar operations to be performed on independent sets of matrixes in parallel. This is done by use of the work-item id (wi\_id) in each cell of the matrixes. Cells with the same wi\_id are considered part of the same matrix. In the myriad form, each input matrix A, B, and (optionally) C can contain many independent matrixes. The wi\_ids are matched up such that each operation involves the A, B, and C with the same wi\_id. A and B must therefore contain the same set of wi\_ids, while C is optional for any wi\_id. The same parameters: alpha, beta, transposeA, and transposeB are used for all work-items. The result will contain cells from all provided work-items. Result has same shape as C if provided. Note that matrixes are not explicitly

dimensioned. The shape is determined by the highest value of x and y for each work-item.

PARAMETER transposeA Boolean indicating whether matrix A should be transposed before multiplying

PARAMETER transposeB Same as above but for matrix B

PARAMETER alpha Scalar multiplier for alpha \* A \* B

PARAMETER A\_in 'A' matrix (multiplier) in Layout\_Cell format

PARAMETER B\_in Same as above for the 'B' matrix (multiplicand)

**PARAMETER** C\_in Same as above for the 'C' matrix (addend). May be omitted.

**PARAMETER** beta A scalar multiplier for beta \* C, scales the C matrix before addition. May be omitted.

**RETURN** Result matrix in Layout\_Cell format.

SEE PBblas/Types.Layout\_Cell

# PBblas/ getrf

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#### **IMPORTS**

PBblas.Types | PBblas.internal | PBblas.internal.Types | std.blas | PBblas.internal.MatDims | std.system.Thorlib |

#### **DESCRIPTIONS**

## **FUNCTION** getrf

DATASET(Layout_Cell)	getrf
(DATASET(Layout_Cell) A)	

LU Factorization Splits a matrix into Lower and Upper triangular factors Produces composite LU matrix for the diagonal blocks. Iterates through the matrix a row of blocks and column of blocks at a time. Partition A into M block rows and N block columns. The A11 cell is a single block. A12 is a single row of blocks with N-1 columns. A21 is a single column of blocks with M-1 rows. A22 is a sub-matrix of M-1 x N-1 blocks. | A11 A12 | | L11 0 | | U11 U12 | | A21 A22 | == | L21 L22 | \* | 0 U22 | | L11\*U11 L11\*U12 | == | L21\*U11 L21\*U12 + L22\*U22 | Based upon PB-BLAS: A set of parallel block basic linear algebra subprograms by Choi and Dongarra This module supports the "Myriad" style interface, allowing many independent problems to be worked on at once. The A matrix can contain multiple matrixes to be factored, indicated by different values for work-item id (wi\_id). Note: The returned matrix includes both the upper and lower factors. This matrix can be used directly by trsm which will only use the part indicated by trsm's 'triangle' parameter (i.e. upper or lower). To extract the upper or lower triangle explicitly for other purposes, use the ExtractTri function. When passing the Lower matrix to the triangle solver (trsm), set the "Diagonal" parameter to "UnitTri". This is necessary because both triangular matrixes returned from this function are packed into a square matrix with only one diagonal. By convention, The Lower triangle is assumed to be a Unit Triangle (diagonal all ones), so the diagonal

contained in the returned matrix is for the Upper factor and must be ignored (i.e. assumed to be all ones) when referencing the Lower triangle.

**PARAMETER** A The input matrix in Types.Layout\_Cell format

**RETURN** Resulting factored matrix in Layout\_Cell format

SEE Types.Layout\_Cell

SEE ExtractTri

## $\frac{\text{PBblas}/}{\textbf{HadamardProduct}}$

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#### **IMPORTS**

PBblas.internal | PBblas.internal.MatDims | PBblas.Types | PBblas.internal.Types | PBblas.internal.Converted | std.blas | std.system.Thorlib |

#### **DESCRIPTIONS**

## **FUNCTION** HadamardProduct

DATASET(Layout_Cell)	HadamardProduct
(DATASET(Layout_Cell)	X, DATASET(Layout_Cell) Y)

Element-wise multiplication of X \* Y. Supports the "myriad" style interface - X and Y may contain multiple separate matrixes. Each X will be multiplied by the Y with the same work-item id. Note: This performs element-wise multiplication. For dot-product matrix multiplication, use PBblas.gemm.

PARAMETER X A matrix (or multiple matrices) in Layout\_Cell form

PARAMETER Y A matrix (or multiple matrices) in Layout\_Cell form

**RETURN** A matrix (or multiple matrices) in Layout\_Cell form

SEE PBblas/Types.Layout Cell

## PBblas/ IElementFunc

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## **IMPORTS**

PBblas |

#### **DESCRIPTIONS**

## **FUNCTION** IElementFunc

```
value_t | IElementFunc
(value_t v, dimension_t r, dimension_t c)
```

Function prototype for a function to apply to each element of the distributed matrix Base your function on this prototype:

PARAMETER <u>v</u> Input value

PARAMETER <u>r</u> Row number (1 based)

PARAMETER <u>c</u> Column number (1 based)

**RETURN** Output value

SEE PBblas/Apply2Elements

# PBblas/ MatUtils

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## **IMPORTS**

PBblas | PBblas.Types | PBblas.internal | PBblas.internal.Types | PBblas.internal.MatDims |

## **DESCRIPTIONS**

## **MODULE** MatUtils

**MatUtils** 

Provides various utility attributes for manipulating cell-based matrixes

SEE Std/PBblas/Types.Layout\_Cell

#### Children

- 1. GetWorkItems: Get a list of work-item ids from a matrix containing one or more work items
- 2. InsertCols: Insert one or more columns of a fixed value into a matrix
- 3. Transpose: Transpose a matrix This attribute supports the myriad interface

#### **FUNCTION** GetWorkItems

#### MatUtils \

```
DATASET(Layout_WI_ID) GetWorkItems

(DATASET(Layout_Cell) cells)
```

Get a list of work-item ids from a matrix containing one or more work items

PARAMETER cells A matrix in Layout\_Cell format

**RETURN** DATASET(Layout\_WI\_ID), one record per work-item

SEE PBblas/Types.Layout\_Cell

SEE PBblas/Types.Layout\_WI\_ID

#### **FUNCTION** InsertCols

#### MatUtils \

DATASET(Layout_Cell)	InsertCols
<pre>(DATASET(Layout_Cell) insert_val=1)</pre>	M, UNSIGNED cols_to_insert=1, value_t

Insert one or more columns of a fixed value into a matrix. Columns are inserted before the first original column. This attribute supports the myriad interface. Multiple independent matrixes can be represented by M.

PARAMETER  $\underline{\mathbf{M}}$  the input matrix

PARAMETER cols\_to\_insert the number of columns to insert, default 1

PARAMETER insert val the value for each cell of the new column(s), default 0

**RETURN** matrix in Layout\_Cell format with additional column(s)

## **FUNCTION** Transpose

#### MatUtils \

DATASET(Layout_Cell)	Transpose
(DATASET(Layout_Cell) M)	

Transpose a matrix This attribute supports the myriad interface. Multiple independent matrixes can be represented by M.

**PARAMETER** M A matrix represented as DATASET(Layout\_Cell)

**RETURN** Transposed matrix in Layout\_Cell format

SEE PBblas/Types.Layout\_Cell

# PBblas/ potrf

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#### **IMPORTS**

PBblas.Types | std.blas | PBblas.internal | PBblas.internal.Types | PBblas.internal.MatDims | PBblas.internal.Converted | std.system.Thorlib |

#### **DESCRIPTIONS**

### **FUNCTION** potrf

```
DATASET(Layout_Cell) potrf

(Triangle tri, DATASET(Layout_Cell) A_in)
```

Implements Cholesky factorization of  $A = U^{**}T^*U$  if Triangular. Upper requested or  $A = L^*L^{**}T$  if Triangular. Lower is requested. The matrix A must be symmetric positive definite.

So, use Cholesky on the first block to get L11. L21 = A21\*L11\*\*T\*\*-1 which can be found by dtrsm on each column block A22' is A22 - L21\*L21\*\*T

Based upon PB-BLAS: A set of parallel block basic linear algebra subprograms by Choi and Dongarra

This module supports the "Myriad" style interface, allowing many independent problems to be worked on at once. The A matrix can contain multiple matrixes to be factored, indicated by different values for work-item id (wi\_id).

**PARAMETER** <u>tri</u> Types. Triangle enumeration indicating whether we are looking for the Upper or the Lower factor

PARAMETER A\_in The matrix or matrixes to be factored in Types.Layout\_Cell format

**RETURN** Triangular matrix in Layout\_Cell format

SEE Std.PBblas.Types.Layout\_Cell

**SEE** Std.PBblas.Types.Triangle

# PBblas/ scal

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## **IMPORTS**

PBblas | PBblas.Types |

## **DESCRIPTIONS**

## **FUNCTION** scal

DATASET(Layout_Cell)	scal
(value_t alpha, DATASET(Layout_Cell) X)	

Scale a matrix by a constant Result is alpha \* X This supports a "myriad" style interface in that X may be a set of independent matrices separated by different work-item ids.

PARAMETER <u>alpha</u> A scalar multiplier

**PARAMETER**  $\underline{\mathbf{X}}$  The matrix(es) to be scaled in Layout\_Cell format

**RETURN** Matrix in Layout\_Cell form, of the same shape as X

SEE PBblas/Types.Layout\_Cell

## PBblas/

## tran

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#### **IMPORTS**

PBblas.Types | PBblas.internal | PBblas.internal.Types | PBblas.internal.MatDims | PBblas.internal.Converted | std.blas | std.system.Thorlib |

#### **DESCRIPTIONS**

## **FUNCTION** tran

```
DATASET(Layout_Cell) tran

(value_t alpha, DATASET(Layout_Cell) A, value_t beta=0,
DATASET(Layout_Cell) C=empty_c)
```

Transpose a matrix and sum into base matrix result  $\leq$  = alpha \* A\*\*t + beta \* C, A is n by m, C is m by n A\*\*T (A Transpose) and C must have same shape

PARAMETER alpha Scalar multiplier for the A\*\*T matrix

PARAMETER A matrix in DATASET(Layout\_Cell) form

PARAMETER beta Scalar multiplier for the C matrix

PARAMETER C C matrix in DATASET(Layout\_Call) form

**RETURN** Matrix in DATASET(Layout\_Cell) form alpha \* A\*\*T + beta \* C

SEE PBblas/Types.layout\_cell

## PBblas/

## trsm

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#### **IMPORTS**

PBblas.Types | std.blas | PBblas.internal | PBblas.internal.Types | PBblas.internal.MatDims | PBblas.internal.Converted | std.system.Thorlib |

#### **DESCRIPTIONS**

## **FUNCTION** trsm

```
DATASET(Layout_Cell) trsm

(Side s, Triangle tri, BOOLEAN transposeA, Diagonal diag, value_t alpha, DATASET(Layout_Cell) A_in, DATASET(Layout_Cell) B_in)
```

Partitioned block parallel triangular matrix solver. Solves for X using: AX = B or XA = B A is is a square triangular matrix, X and B have the same dimensions. A may be an upper triangular matrix (UX = B or XU = B), or a lower triangular matrix (LX = B or XL = B). Allows optional transposing and scaling of A. Partially based upon an approach discussed by MJ DAYDE, IS DUFF, AP CERFACS. A Parallel Block implementation of Level-3 BLAS for MIMD Vector Processors ACM Tran. Mathematical Software, Vol 20, No 2, June 1994 pp 178-193 and other papers about PB-BLAS by Choi and Dongarra This module supports the "Myriad" style interface, allowing many independent problems to be worked on at once. Corresponding A and B matrixes are related by a common work-item identifier (wi\_id) within each cell of the matrix. The returned X matrix will contain cells for the same set of work-items as specified for the A and B matrices.

**PARAMETER**  $\underline{\mathbf{s}}$  Types. Side enumeration indicating whether we are solving AX = B or XA = B

**PARAMETER** <u>tri</u> Types. Triangle enumeration indicating whether we are solving an Upper or Lower triangle.

PARAMETER solving Eranspose Boolean indicating whether or not to transpose the A matrix before

**PARAMETER** diag Types. Diagonal enumeration indicating whether A is a unit matrix or not. This is primarily used after factoring matrixes using getrf (LU factorization). That module produces a factored matrix stored within the same space as the original matrix. Since the diagonal is used by both factors, by convention, the Lower triangle has a unit matrix (diagonal all 1's) while the Upper triangle uses the diagonal cells. Setting this to UnitTri, causes the contents of the diagonal to be ignored, and assumed to be 1. NotUnitTri should be used for most other cases.

PARAMETER alpha Multiplier to scale A

PARAMETER A\_in The A matrix in Layout\_Cell format

PARAMETER B\_in The B matrix in Layout\_Cell format

RETURN X solution matrix in Layout\_Cell format

SEE Types.Layout\_Cell

**SEE** Types.Triangle

SEE Types.Side

# $rac{ ext{PBblas}/}{ ext{Types}}$

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#### **IMPORTS**

ML\_Core | ML\_Core.Types |

#### **DESCRIPTIONS**

## **MODULE** Types

**Types** 

Types for the Parallel Block Basic Linear Algebra Sub-programs support WARNING: attributes marked with WARNING can not be changed without making corresponding changes to the C++ attributes.

#### Children

- 1. dimension\_t : Type for matrix dimensions
- 2. partition\_t : Type for partition id only supports up to 64K partitions
- 3. work\_item\_t: Type for work-item id only supports up to 64K work items
- 4. value\_t : Type for matrix cell values
- 5. m\_label\_t: Type for matrix label
- 6. Triangle: Enumeration for Triangle type
- 7. Diagonal: Enumeration for Diagonal type
- 8. Side: Enumeration for Side type

- 9. t\_mu\_no: Type for matrix universe number
- 10. Layout\_Cell: Layout for Matrix Cell Main representation of Matrix cell at interface to all PBBlas functions
- 11. Layout\_Norm: Layout for Norm results

## **ATTRIBUTE** dimension\_t

Types \

dimension t

Type for matrix dimensions. Uses UNSIGNED four as matrixes are not designed to support more than 4 B rows or columns.

## **ATTRIBUTE** partition\_t

Types \

partition\_t

Type for partition id – only supports up to  $64\mathrm{K}$  partitions

## ATTRIBUTE work\_item\_t

Types  $\setminus$ 

 ${\bf work\_item\_t}$ 

Type for work-item id – only supports up to  $64\mathrm{K}$  work items

## ATTRIBUTE value\_t

Types \

value\_t

Type for matrix cell values WARNING: type used in C++ attribute

## ATTRIBUTE m\_label\_t

Types \

 $m\_label\_t$ 

Type for matrix label. Used for Matrix dimensions (see Layout\_Dims) and for partitions (see Layout\_Part)

## **ATTRIBUTE** Triangle

Types \

Triangle

Enumeration for Triangle type WARNING: type used in C++ attribute

## **ATTRIBUTE** Diagonal

Types \

Diagonal

Enumeration for Diagonal type WARNING: type used in C++ attribute

### **ATTRIBUTE Side**

Types \

Side

Enumeration for Side type WARNING: type used in C++ attribute

## ATTRIBUTE t\_mu\_no

Types \

t\_mu\_no

Type for matrix universe number Allow up to 64k matrices in one universe

## RECORD Layout\_Cell

Types \

Layout Cell

Layout for Matrix Cell Main representation of Matrix cell at interface to all PBBlas functions. Matrixes are represented as DATASET(Layout\_Cell), where each cell describes the row and column position of the cell as well as its value. Only the non-zero cells need to be contained in the dataset in order to describe the matrix since all unspecified cells are considered to have a value of zero. The cell also contains a work-item number that allows multiple separate matrixes to be carried in the same dataset. This supports the "myriad" style interface that allows the same operations to be performed on many different sets of data at once. Note that these matrixes do not have an explicit size. They are sized implicitly, based on the maximum row and column presented in the data. A matrix can be converted to an explicit dense form (see matrix\_t) by using the utility module MakeR8Set. This module should only be used for known small matrixes (< 1M cells) or for partitions of a larger matrix. The Converted module provides utility functions to convert to and from a set of partitions (See Layout\_parts).

- **FIELD** <u>wi\_id</u> Work Item Number An identifier from 1 to 64K-1 that separates and identifies individual matrixes
- **FIELD**  $\underline{\mathbf{x}}$  1-based row position within the matrix
- FIELD y 1-based column position within the matrix
- FIELD <u>v</u> Real value for the cell
- SEE matrix\_t
- SEE Std/PBblas/MakeR8Set.ecl
- SEE Std/PBblas/Converted.ecl WARNING: Used as C++ attribute. Do not change without corresponding changes to MakeR8Set.

## **RECORD** Layout\_Norm

Types \

Layout\_Norm

Layout for Norm results.

- **FIELD** wi\_id Work Item Number An identifier from 1 to 64K-1 that separates and identifies individual matrixes
- **FIELD v** Real value for the norm

# ${\bf Vector 2 Diag}$

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#### **IMPORTS**

PBblas.internal | PBblas.internal.MatDims | PBblas.Types | PBblas.internal.Types | PBblas.Constants |

## **DESCRIPTIONS**

## **FUNCTION** Vector2Diag

DATASET(Layout_Cell)	Vector2Diag
(DATASET(Layout_Cell) X)	

Convert a vector into a diagonal matrix. The typical notation is D = diag(V). The input X must be a 1 x N column vector or an N x 1 row vector. The resulting matrix, in either case will be N x N, with zero everywhere except the diagonal.

**PARAMETER** X A row or column vector (i.e. N x 1 or 1 x N) in Layout\_Cell format

**RETURN** An N x N matrix in Layout\_Cell format

SEE PBblas/Types.Layout\_cell