## **ECL DOCUMENTATION**



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Name	GaussianProcessRegression			
Version	1.0			
Description	cription RFF-accelerated Gaussian Process Regression			
License	e http://www.apache.org/licenses/LICENSE-2.0			
Copyright	Copyright (C) 2022 HPCC Systems®			
Authors	HPCCSystems			
DependsOn	ML_Core			
Platform	8.4.0			

#### **OVERVIEW**

### **Gaussian Process Regression (GPR)**

This bundle provides a Random Fourier Features accelerated version of Gaussian Process Regressor. It allows Data Scientist, researchers or software programmers to apply Gaussian Process Regressor in the parallelized environment of HPCC Systems.

Random Fourier Features (RFF) map the input data to a randomized low-dimensional feature space. Then one can apply fast existing linear methods to such new space and thus accelerate the training of large scale kernel machines [1]. This bundle is the accelerated version of Gaussian Process Regression (GPR) using such random fourier features.

The module GPRI is the main ECL interface. Three functions are available to the users: getSession, fit and predict.

- getSession function generates a 'session ID' for the training and predict process.
- fit function fits the input data and train a GPR model.
- predict funcion uses the trained GPR model to make predictions for the new observations.

For details of each function, see the comments below above each function in GPRI.ecl file. For details of record structure used in these functions, see Types.ecl file. For usage examples of GPR bundle, see the test cases in Test/test.ecl file.

To use GPR bundle, 'session ID' is required to feed to each fit or predict function call. However, if the training and predict process are in the same session/workunit, getSession only needs to be called once, i.e. fit and predict share same 'session ID' in this case.

#### INSTALLATION

Python3 must be installed on each node of HPCC Systems. ML\_Core bundle from HPCC Systems Machine Learning Library should be installed as well. To install GPR bundle, run following command via HPCC Systems client tool:

ecl bundle install https://github.com/hpcc-systems/GaussianProcessRegression.git

#### **EXAMPLES**

Test examples are included in the Test folder. Under Test folder, test.ecl file shows the process to define session ID, fit a GPR model and make predictions. The testing data is generated by M\_dataGen.ecl file which generates random test data by user defined size.

#### OTHER DOCUMENTATIONS

**HPCC Systems Machine Learning Library** 

Using HPCC Systems Machine Learning Library

#### **ACKNOWLEDGEMENT**

This bundle is built upon the original python implementation of GPR module from below source: https://github.com/gwgundersen/random-fourier-features

#### **REFERENCE**

[1] Ali Rahimi and Benjamin Recht. 2007. Random features for large-scale kernel machines. In Proceedings of the 20th International Conference on Neural Information Processing Systems (NIPS'07). Curran Associates Inc., Red Hook, NY, USA, 1177–1184.

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GPRI.ecl	
Types.ecl	
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# **GPRI**

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## **IMPORTS**

python3 | \_versions.ML\_Core.V3\_2\_2.ML\_Core.Types | std.system.Thorlib | Types | Internal.rffGPR |

# **DESCRIPTIONS**

# **GPRI**

**GPRI** 

No Documentation Found

#### Children

- 1. GetSession: Initialize GPR on all nodes and return a session ID to be used in the following process
- 2. fit: Train a RFF acclerated GPR model
- 3. predict: Predict using trained GPR model

## **GETSESSION**

GPRI/

INTEGER GetSession
()

Initialize GPR on all nodes and return a session ID to be used in the following process. This function needs to be called before any other process.

**RETURN INTEGER8** — sessID session ID to identify this session.

## FIT

#### GPRI/

```
DATASET(Layout_model2) fit

(INTEGER session, DATASET(NumericField) x,
DATASET(NumericField) y, UNSIGNED4 rff_dim = 10, REAL sigma =
1)
```

#### Train a RFF acclerated GPR model

PARAMETER session || INTEGER8 — No Doc

PARAMETER <u>x</u> || TABLE ( NumericField ) — No Doc

PARAMETER  $\mathbf{y} \parallel \parallel$  TABLE ( NumericField ) — No Doc

PARAMETER rff\_dim || UNSIGNED4 — No Doc

PARAMETER sigma ||| REAL8 — No Doc

**RETURN TABLE (layout\_model2)** — Gaussian process regression model in Layout\_model2 foramt.

**PARAMS** session session ID for the training process.

PARAMS x independent training data.

PARAMS y dependent training data.

**PARAMS** rff\_dim dimesion of random fourier features.

**PARAMS** sigma squre root of the variance.

SEE ML\_Core.Types.Layout\_Model2

## **PREDICT**

#### **GPRI** /

#### DATASET(NumericField) predict

(INTEGER session, DATASET(Layout\_model2) mod,
DATASET(NumericField) x)

#### Predict using trained GPR model

PARAMETER <u>session</u> || INTEGER8 — No Doc

PARAMETER mod || TABLE (layout\_model2) — No Doc

PARAMETER <u>x</u> || TABLE ( NumericField ) — No Doc

**RETURN** TABLE ( NumericField ) — prediction result in NumericField format

PARAMS session session ID for the predicting process.

PARAMS mod trained GPR model.

**PARAMS** x input data for prediction.

SEE ML\_Core.Types.NumericField

# **Types**

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# **DESCRIPTIONS**



**Types** 

No Documentation Found

#### Children

1. initParams: No Documentation Found

# **INITPARAMS**

Types /

**initParams** 

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FIELD <u>nodeid</u> ||| UNSIGNED4 — No Doc

FIELD <u>nnodes</u> ||| UNSIGNED4 — No Doc

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rffGPR.ecl

# Internal/ rffGPR

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# **IMPORTS**

python3 | \_versions.ML\_Core.V3\_2\_2.ML\_Core.Types | std.system.Thorlib | Types |

# **DESCRIPTIONS**

# RFFGPR

rffGPR

No Documentation Found

#### Children

1. init: No Documentation Found

2. fit: No Documentation Found

3. predict: No Documentation Found



rffGPR/

# STREAMED DATASET({INTEGER sessID}) init (STREAMED DATASET(initParams) initDat, STRING wuid = WORKUNIT)

#### No Documentation Found

```
PARAMETER initdat || TABLE (initParams) — No Doc
```

PARAMETER wuid || STRING — No Doc

RETURN TABLE ({INTEGER8 sessID}) —

## FIT

#### rffGPR/

```
DATASET(Layout_model2) fit

(INTEGER session, DATASET(NumericField) x,
DATASET(NumericField) y, UNSIGNED4 dim = 10, REAL sig = 1)
```

#### No Documentation Found

```
PARAMETER session || INTEGER8 — No Doc
```

PARAMETER **x** || TABLE ( NumericField ) — No Doc

PARAMETER y || TABLE ( NumericField ) — No Doc

PARAMETER dim || UNSIGNED4 — No Doc

PARAMETER sig ||| REAL8 — No Doc

RETURN TABLE (layout\_model2) —

## **PREDICT**

#### rffGPR/

#### STREAMED DATASET(NumericField) predict

(STREAMED DATASET(Layout\_model2) mod, STREAMED DATASET(NumericField) x, INTEGER session)

#### No Documentation Found

PARAMETER mod || TABLE (layout\_model2) — No Doc

PARAMETER <u>x</u> || TABLE ( NumericField ) — No Doc

PARAMETER session || INTEGER8 — No Doc

RETURN TABLE (NumericField) —

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### Test/

# **M\_dataGen**

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# **IMPORTS**

python3 | \_versions.ML\_Core.V3\_2\_2.ML\_Core.Types |

# **DESCRIPTIONS**

# M\_DATAGEN

a EXPORT | M\_dataGen

(INTEGER n, INTEGER n train)

No Documentation Found

PARAMETER <u>n</u> || INTEGER8 — No Doc

#### Children

- 1. l: No Documentation Found
- 2. toNF: No Documentation Found
- 3. generateXData: No Documentation Found
- 4. x: No Documentation Found

5. generateYData: No Documentation Found 6. y: No Documentation Found 7. X\_train: No Documentation Found 8. Y\_train: No Documentation Found 9. X\_test: No Documentation Found 10. Y\_test: No Documentation Found M\_dataGen/ l No Documentation Found FIELD <u>x</u> ||| SET ( REAL8 ) — No Doc TONF M\_dataGen / toNF (set of REAL input) No Documentation Found PARAMETER input || SET ( REAL8 ) — No Doc RETURN TABLE ({ UNSIGNED2 wi, UNSIGNED8 id, UNSIGNED4 number, REAL8 value})—

# GENERATEXDATA

M\_dataGen /

set of real generateXData

(INTEGER n)

No Documentation Found

PARAMETER <u>n</u> || INTEGER8 — No Doc

RETURN SET (REAL8) —

X

M\_dataGen /

X

No Documentation Found

# **GENERATEYDATA**

M\_dataGen /

set of real generateYData

(set of real x\_data)

No Documentation Found

PARAMETER x\_data ||| SET ( REAL8 ) — No Doc

RETURN SET (REAL8) —



M\_dataGen /

У

No Documentation Found

# X\_TRAIN

M\_dataGen /

; EXPORT X\_train

No Documentation Found

# Y\_TRAIN

M\_dataGen /

; EXPORT Y\_train

No Documentation Found



M\_dataGen /

; EXPORT X\_test



M\_dataGen /

; EXPORT Y\_test

# Test/ pyGPR

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# **IMPORTS**

python3 | \_versions.ML\_Core.V3\_2\_2.ML\_Core.Types | Types |

# **DESCRIPTIONS**

# **PYGPR**

DATASET(NumericField) pyGPR

(DATASET(NumericField) x, DATASET(NumericField) y)

No Documentation Found

PARAMETER  $\underline{\mathbf{x}}$  ||| TABLE ( NumericField ) — No Doc

PARAMETER y || TABLE ( NumericField ) — No Doc

 ${\bf RETURN} \ \ {\bf TABLE} \ ( \ {\bf NumericField} \ ) - \\$ 

#### Test/

## score

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## **IMPORTS**

```
_versions.ML_Core.V3_2_2.ML_Core | _versions.ML_Core.V3_2_2.ML_Core.Types | _versions.PBblas.V3_0_2.PBblas | _versions.PBblas.V3_0_2.PBblas.Types | _versions.PBblas.V3_0_2.PBblas.Converted | _versions.PBblas.V3_0_2.PBblas.MatUtils | _versions.ML_Core.V3_2_2.ML_Core.Math |
```

## **DESCRIPTIONS**

## **SCORE**

#### score

(DATASET(NumericField) X=empty\_data, DATASET(NumericField) y=empty\_data, DATASET(NumericField) Yhat=empty\_data)

#### No Documentation Found

PARAMETER <u>x</u> || TABLE ( NumericField ) — No Doc

PARAMETER y || TABLE ( NumericField ) — No Doc

PARAMETER | yhat || | TABLE ( NumericField ) — No Doc

#### Children

1	sumX	· No	Docume	ntation	Found

2. sumy: No Documentation Found

3. sumYY: No Documentation Found

4. n: No Documentation Found

5. x2: No Documentation Found

6. sumX2: No Documentation Found

7. y2: No Documentation Found

8. sumY2: No Documentation Found

9. p1: No Documentation Found

10. p2: No Documentation Found

11. r: No Documentation Found

12. r2: No Documentation Found

## SUMX

score /

sumX

No Documentation Found

RETURN REAL8 —

# SUMY

score /

sumy

RETURN REAL8 —
SUMYY
core /
sumYY
o Documentation Found
RETURN REAL8 —
core /
n
o Documentation Found
RETURN INTEGER8 —
<b>K2</b>
core /
x2

RETURN TABLE ( { UNSIGNED2 wi , UNSIGNED8 id , UNSIGNED4 number , REAL8 value } ) —
SUMX2
score /
sumX2
No Documentation Found
RETURN REALS —
Y2
score /
y2
No Documentation Found
$\textbf{RETURN}  \textbf{TABLE} \ ( \ \{ \ \textbf{UNSIGNED2} \ \textbf{wi} \ , \ \textbf{UNSIGNED4} \ \textbf{number} \ , \ \textbf{REAL8} \ \textbf{value} \ \}  )  - $
SUMY2
score /
sumY2

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RETURN REAL8 —
P1
score /
p1
No Documentation Found
RETURN REAL8 —
P2
score /
p2
No Documentation Found
RETURN REAL8 —
R
score /
r





score /

r2

No Documentation Found

RETURN REAL8 —