

# Package ‘STCCGEV’

March 27, 2025

**Title** Conditional Copula Model for Crop Yield Forecasting

**Version** 1.0.0

**Description** Provides functions to model and forecast crop yields using a spatial temporal conditional copula approach.  
The package incorporates extreme weather covariates and Bayesian Structural Time Series models to analyze crop yield dependencies across multiple regions. Includes tools for fitting, simulating, and visualizing results.  
This method build upon established R packages, including 'Hofert' 'et' 'al'. (2025) <[doi:10.32614/CRAN.package.copula](https://doi.org/10.32614/CRAN.package.copula)>, 'Scott' (2024) <[doi:10.32614/CRAN.package.bsts](https://doi.org/10.32614/CRAN.package.bsts)>, and 'Stephenson' 'et' 'al'. (2024) <[doi:10.32614/CRAN.package.evd](https://doi.org/10.32614/CRAN.package.evd)>.

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**Encoding** UTF-8

**RoxygenNote** 7.3.2

**Imports** bsts, copula, evd, ggplot2, grDevices, rootSolve, stats, utils

**Depends** R (>= 4.0.0)

**LazyData** true

**LazyDataCompression** xz

**Suggests** knitr, rmarkdown, testthat (>= 3.0.0),

**VignetteBuilder** knitr

**Config/testthat/edition** 3

**NeedsCompilation** no

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clayton.theta	<i>Compute Clayton Copula Parameter from Kendall's Tau</i>
---------------	--

---

**Description**

Computes the Clayton copula dependence parameter based on Kendall's tau.

**Usage**

```
clayton.theta(tau)
```

**Arguments**

tau                    Numeric, Kendall's tau correlation coefficient.

**Value**

Numeric, estimated Clayton copula parameter.

---

copula_list	<i>Supported copula types</i>
-------------	-------------------------------

---

**Description**

A list containing supported copula types.

**Usage**

```
copula_list
```

**Format**

A list of copula types.

**copulas** "Gaussian" "Clayton" "Frank" "Gumbel" "Joe"

---

crophyields\_covariates *Data of the article "Probabilistic Crop Yields Forecasts With Spatio-Temporal Conditional Copula Using Extreme Weather Covariates"*

---

### Description

Contains crop yields and climate indices data of 24 CD regions in Ontario from 1950 to 2022

### Usage

crophyields\_covariates

### Format

A data frame with 1752 rows and 38 variables:

**time** chr: year from 1950-2022

**CAR\_CODE** num: 1-4

**CAR** chr: Southern, Western, Central, Eastern Ontario

**CD\_CODE** num

**CD** chr: 24 subregions

**ID** chr

**lat** num: latitude

**lon** num: longitude

**yield** num: wheat crop yield per census division, in bushel/acre

**cdd** num: Annual maximum number of consecutive days with daily precipitation below 1mm (unit = days)

**cddcold\_18** num: Annual cooling degree days above 18C (unit = degree\_days)

**dlyfrzthw\_tx0\_tn** num: Annual number of days with a diurnal freeze-thaw cycle : tmax > 0 degc and tmin <= -1 degc

**first\_fall\_frost** num: First day of year with temperature below 0 degc for at least 1 days

**frost\_days** num: Annual number of days with minimum daily temperature below 0C

**ice\_days** num: Annual number of days with maximum daily temperature below 0 degC

**nr\_cdd** num: The annual number of dry periods of 6 days and more, during which the maximal precipitation on a window of 6 days is under 1.0 mm

**preptot** num: Annual total precipitation (unit = mm)

**r1mm** num: Annual number of days with daily precipitation over 1.0 mm/day

**r10mm** num: Annual number of days with daily precipitation over 10.0 mm/day

**r20mm** num: Annual number of days with daily precipitation over 20.0 mm/day

**rx1day** num: Annual maximum 1-day total precipitation (unit = mm)

**rx5day** num: Annual maximum 5-day total precipitation (unit = mm)

**tg\_mean** num: Annual mean of daily mean temperatures (unit = C degrees)  
**tn\_mean** num: Annual mean of daily minimum temperatures (unit = C degrees)  
**tn\_min** num: Annual minimum of daily minimum temperatures (unit = C degrees)  
**tnlt\_-15** num: Annual number of days where daily minimum temperature is below -15 degC  
**tnlt\_-25** num: Annual number of days where daily minimum temperature is below -25 degC  
**tr\_18** num: Annual number of tropical nights : defined as days with minimum daily temperature above 18 degc  
**tr\_20** num: Annual number of tropical nights : defined as days with minimum daily temperature above 20 degc  
**tr\_22** num: Annual number of tropical nights : defined as days with minimum daily temperature above 22 degc  
**tx\_max** num: Annual minimum of daily maximum temperature (unit = C degrees)  
**tx\_mean** num: Annual mean of daily maximum temperature (unit = C degrees)  
**txgt\_25** num: Annual number of days where daily maximum temperature exceeds 25 degC  
**txgt\_27** num: Annual number of days where daily maximum temperature exceeds 27 degC  
**txgt\_29** num: Annual number of days where daily maximum temperature exceeds 29 degC  
**txgt\_30** num: Annual number of days where daily maximum temperature exceeds 30 degC  
**txgt\_32** num: Annual number of days where daily maximum temperature exceeds 32 degC

### Source

ClimateData.ca

---

dynamic.rho

*Compute Dynamic Gaussian Copula Correlation Parameter (rho)*

---

### Description

Computes the time-varying correlation parameter (rho) for a Gaussian copula.

### Usage

```
dynamic.rho(params, lagged_rho, X_t)
```

### Arguments

params	Numeric vector of parameters: omega, alpha, and gamma coefficients.
lagged_rho	Numeric, the previous rho value.
X_t	Numeric vector or matrix of covariates at time t.

### Value

Numeric, estimated dynamic Gaussian copula correlation.

---

dynamic.theta.clayton *Compute Dynamic Clayton Copula Parameter*

---

**Description**

Computes the Clayton copula parameter dynamically based on lagged values and covariates.

**Usage**

```
dynamic.theta.clayton(params, lagged_theta, X_t)
```

**Arguments**

params	Numeric vector of parameters: omega, alpha, and gamma coefficients.
lagged_theta	Numeric, the previous theta value.
X_t	Numeric vector or matrix of covariates at time t.

**Value**

Numeric, estimated dynamic Clayton copula parameter.

---

dynamic.theta.frank *Compute Dynamic Frank Copula Parameter*

---

**Description**

Computes the Frank copula parameter dynamically based on lagged values and covariates.

**Usage**

```
dynamic.theta.frank(params, lagged_theta, X_t)
```

**Arguments**

params	Numeric vector of parameters: omega, alpha, and gamma coefficients.
lagged_theta	Numeric, the previous theta value.
X_t	Numeric vector or matrix of covariates at time t.

**Value**

Numeric, estimated dynamic Frank copula parameter.

---

dynamic.theta.gumbel    *Compute Dynamic Gumbel Copula Parameter*

---

**Description**

Computes the Gumbel copula parameter dynamically based on lagged values and covariates.

**Usage**

```
dynamic.theta.gumbel(params, lagged_theta, X_t)
```

**Arguments**

params	Numeric vector of parameters: omega, alpha, and gamma coefficients.
lagged_theta	Numeric, the previous theta value.
X_t	Numeric vector or matrix of covariates at time t.

**Value**

Numeric, estimated dynamic Gumbel copula parameter.

---

dynamic.theta.joe    *Compute Dynamic Joe Copula Parameter*

---

**Description**

Computes the Joe copula parameter dynamically based on lagged values and covariates.

**Usage**

```
dynamic.theta.joe(params, lagged_theta, X_t)
```

**Arguments**

params	Numeric vector of parameters: omega, alpha, and gamma coefficients.
lagged_theta	Numeric, the previous theta value.
X_t	Numeric vector or matrix of covariates at time t.

**Value**

Numeric, estimated dynamic Joe copula parameter.

fit\_bsts

*Fit a Bayesian Structural Time Series (BSTS) Model*

---

**Description**

Fits a BSTS model for a time series  $y$ , given a vector or matrix of covariates  $z$ .

**Usage**

```
fit_bsts(y, z, lags = 0, MCMC.iter = 5000)
```

**Arguments**

$y$	A numeric vector (time series response variable).
$z$	A numeric vector or matrix (covariates).
lags	Integer, number of lags for the autoregressive component.
MCMC.iter	Integer, number of MCMC iterations.

**Value**

A fitted BSTS model.

---

frank.theta

*Compute Frank Copula Parameter from Kendall's Tau*

---

**Description**

Computes the Frank copula dependence parameter based on Kendall's tau.

**Usage**

```
frank.theta(tau)
```

**Arguments**

tau	Numeric, Kendall's tau correlation coefficient.
-----	---

**Value**

Numeric, estimated Frank copula parameter.



---

GH.theta	<i>Compute Gumbel Copula Parameter from Kendall's Tau</i>
----------	---

---

**Description**

Computes the Gumbel-Hougaard copula dependence parameter based on Kendall's tau.

**Usage**

```
GH.theta(tau)
```

**Arguments**

tau                    Numeric, Kendall's tau correlation coefficient.

**Value**

Numeric, estimated Gumbel copula parameter.

---

init_params_full	<i>Initial Parameters for 2D Pseudo-Loglikelihood Estimation</i>
------------------	--

---

**Description**

Initial Parameters for 2D Pseudo-Loglikelihood Estimation

**Usage**

```
init_params_full
```

**Format**

A numeric vector of length  $(2 + M + 4 * D * M)$  where:

**omega** Baseline autoregressive coefficient.

**alpha** Parameter controlling variance.

**gamma1, gamma2, gamma3** Coefficients related to external factors.

**phi\_gev** AR(1) coefficient for GEV.

**sigma\_mu** Std dev of innovations for AR(1) process for GEV.

**sigma\_gev** GEV scale parameter for GEV.

**xi\_gev** GEV shape parameter for GEV.

---

init_params_full_G	<i>Initial Parameters for 2D Pseudo-Loglikelihood-Generalized Estimation</i>
--------------------	--

---

**Description**

Initial Parameters for 2D Pseudo-Loglikelihood-Generalized Estimation

**Usage**

init\_params\_full\_G

**Format**

A numeric vector of length  $(2 + M + 4 * D * M)$ , structured as follows:

**omega** Baseline autoregressive coefficient.

**alpha** Parameter controlling variance.

**gamma1, gamma2, gamma3** Coefficients related to external factors.

**Climate variable parameters** For each climate variable in each region, the following parameters are included:

- mean(z), sd(z), sd(z), xi\_gev for each region and variable.

---

init_params_noGEV	<i>Initial Parameters for 2D Pseudo-Loglikelihood Estimation without GEV models for covariates</i>
-------------------	--

---

**Description**

Initial Parameters for 2D Pseudo-Loglikelihood Estimation without GEV models for covariates

**Usage**

init\_params\_noGEV

**Format**

A numeric vector of length  $(2 + M)$  where:

**omega** Baseline autoregressive coefficient.

**alpha** Parameter controlling variance.

**gamma1, gamma2, gamma3** Coefficients related to external factors.

---

joe.theta

---

*Compute Joe Copula Parameter from Kendall's Tau*


---

**Description**

Computes the Joe copula dependence parameter based on Kendall's tau.

**Usage**

```
joe.theta(tau)
```

**Arguments**

tau                    Numeric, Kendall's tau correlation coefficient.

**Value**

Numeric, estimated Joe copula parameter.

---

log\_likelihood\_Generalized

*Compute Log-Likelihood for a Generalized Dynamic Copula-GEV Model*

---

**Description**

Computes the log-likelihood for a time-varying copula model combined with Generalized Extreme Value (GEV) margins.

**Usage**

```
log_likelihood_Generalized(params, U, Z, X, copula)
```

**Arguments**

params                Numeric vector of model parameters, including copula parameters (omega, alpha, gamma) and GEV distribution parameters.

U                      Numeric matrix (n\_train x D), pseudo-observations for the copula.

Z                      Numeric array (n\_train x D x M), observed data for each margin and sub-feature.

X                      Numeric matrix (n\_train x M), risk factors for the dynamic copula parameter.

copula                Character, specifying the copula type: "Clayton", "Frank", "Gumbel", "Joe", or "Gaussian".

**Value**

Numeric, negative log-likelihood value.

**Examples**

```
test_ll <- log_likelihood_Generalized(init_params_full_G,uu,
                                     zz_train,xx_train,"Gaussian")
```

---

log\_likelihood\_generalized\_2d

*Generalized Log-Likelihood Function for 2D Copula-GEV Model*

---

**Description**

Computes the negative log-likelihood of a 2-dimensional copula-GEV model, incorporating dynamic Generalized Extreme Value (GEV) parameters and a time-varying copula structure.

**Usage**

```
log_likelihood_generalized_2d(params, u1, u2, X_t, z1, z2, copula)
```

**Arguments**

params	Numeric vector, model parameters including copula and GEV parameters.
u1	Numeric vector (length n_train), pseudo-observations for margin 1.
u2	Numeric vector (length n_train), pseudo-observations for margin 2.
X_t	Numeric matrix (n_train × M), risk factors affecting copula parameters.
z1	Numeric matrix (n_train × M), observed data for margin 1.
z2	Numeric matrix (n_train × M), observed data for margin 2.
copula	Character, specifying the copula type: "Clayton", "Frank", "Gumbel", "Joe", or "Gaussian".

**Value**

The negative log-likelihood value for optimization.

**Examples**

```
test_ll_2d <-log_likelihood_generalized_2d(init_params_full,
                                         uu[,1],
                                         uu[,2],
                                         xx_train,
                                         zz_train[,1,],
                                         zz_train[,2,],
                                         "Gaussian")
```

---

log\_likelihood\_noGEV *Compute Log-Likelihood for a Generalized Dynamic Copula Model without GEV covariates*

---

### Description

Computes the log-likelihood for a time-varying copula model.

### Usage

```
log_likelihood_noGEV(params, U, Z, X, copula)
```

### Arguments

params	Numeric vector of model parameters, including copula parameters (omega, alpha, gamma).
U	Numeric matrix (n_train x D), pseudo-observations for the copula.
Z	Numeric array (n_train x D x M), observed data for each margin and sub-feature.
X	Numeric matrix (n_train x M), risk factors for the dynamic copula parameter.
copula	Character, specifying the copula type: "Clayton", "Frank", "Gumbel", "Joe", or "Gaussian".

### Value

Numeric, negative log-likelihood value.

### Examples

```
test_ll_noGEV <- log_likelihood_noGEV(init_params_noGEV,uu,
  zz_train,x_train,"Gaussian")
```

---

medoid\_names *list containing Dufferin and Wellington*

---

### Description

list containing Dufferin and Wellington

### Usage

```
medoid_names
```

### Format

An object of class list of length 2.

---

n_test	19
--------	----

---

**Description**

19

**Usage**

n\_test

**Format**

An object of class integer of length 1.

---

n_train	54
---------	----

---

**Description**

54

**Usage**

n\_train

**Format**

An object of class integer of length 1.

---

plot_forecast	<i>Plot Observed Data and BSTS Forecast</i>
---------------	---

---

**Description**

Creates a plot of observed data, forecasted values, and confidence intervals.

**Usage**

```
plot_forecast(  
  forecast,  
  data_train,  
  data_test,  
  time,  
  quant_high,  
  quant_low,  
  observed_col,  
  forecast_col,  
  title  
)
```

**Arguments**

forecast	A matrix of BSTS forecast samples.
data_train	Numeric vector, training data.
data_test	Numeric vector, test data.
time	Numeric vector, representing time indices.
quant_high	Numeric, upper quantile for confidence interval.
quant_low	Numeric, lower quantile for confidence interval.
observed_col	Character, color for observed data.
forecast_col	Character, color for forecasted data.
title	Character, title of the plot.

**Value**

A ggplot2 object.

---

plot\_forecast\_compare *Compare Forecasts from Two Models*

---

**Description**

Generates a time series plot comparing the forecasts from two models along with observed data.

**Usage**

```
plot_forecast_compare(  
  forecast1,  
  forecast2,  
  data_train,  
  data_test,  
  time,
```

```

    quant_high,
    quant_low,
    col1,
    title
  )

```

### Arguments

forecast1	Numeric matrix, forecasted values from the first model (columns: time points).
forecast2	Numeric matrix, forecasted values from the second model (columns: time points).
data_train	Numeric vector, training data used for modeling.
data_test	Numeric vector, actual test data for evaluation.
time	Numeric vector, representing the time points corresponding to the data.
quant_high	Numeric, upper quantile (e.g., 0.9) for confidence interval.
quant_low	Numeric, lower quantile (e.g., 0.1) for confidence interval.
col1	Character, color for observed data lines.
title	Character, title for the plot.

### Value

A ggplot2 object showing the forecast comparison.

---

simul.fun.noGEV	<i>Simulate Multivariate Crop Yield Data Using a Generalized Copula-BSTS Model Without GEV Covariates</i>
-----------------	---

---

### Description

This function simulates multivariate crop yield data using a time-varying copula combined with Bayesian Structural Time Series (BSTS) models without GEV covariates for comparison.

### Usage

```

simul.fun.noGEV(
  nsim = 100,
  n_train,
  n_test,
  copula,
  init_params,
  fn,
  U_train,
  Z_train,
  Z_test,
  X_train,
  X_test,
  Y_test,
  BSTS_list
)

```



**Arguments**

<code>nsim</code>	Integer, number of simulation replications.
<code>n_train</code>	Integer, number of training observations.
<code>n_test</code>	Integer, number of test observations.
<code>copula</code>	Character, specifying the copula type: "Clayton", "Frank", "Gumbel", "Joe", or "Gaussian".
<code>init_params</code>	Numeric vector, initial parameter values for optimization.
<code>fn</code>	Function, log-likelihood function for parameter estimation.
<code>U_train</code>	Numeric matrix ( $n_{train} \times D$ ), pseudo-observations for the copula.
<code>Z_train</code>	Numeric array ( $n_{train} \times D \times M$ ), observed data for each margin and sub-feature.
<code>Z_test</code>	Numeric array ( $n_{test} \times D \times M$ ), observed data for each margin and sub-feature.
<code>X_train</code>	Numeric matrix ( $n_{train} \times M$ ), risk factors for the dynamic copula parameter.
<code>X_test</code>	Numeric matrix ( $n_{test} \times M$ ), risk factors for the dynamic copula parameter.
<code>Y_test</code>	Numeric matrix ( $n_{test} \times D$ ), true future values for MSE calculation.
<code>BSTS_list</code>	List of length $D$ , each element is a BSTS model for a different margin.

**Value**

A list containing:

<code>optim_results</code>	Results from the optimization process.
<code>theta_sim</code>	Simulated copula parameters across replications.
<code>Y_sim</code>	Simulated final BSTS-based forecasts.
<code>MSE</code>	Mean squared error for each simulation run.

---

`simulation_generalized`

*Simulate Multivariate Crop Yield Data Using a Generalized Copula-GEV-BSTS Model*

---

**Description**

This function simulates multivariate crop yield data using a time-varying copula combined with Generalized Extreme Value (GEV) margins and Bayesian Structural Time Series (BSTS) models.

**Usage**

```
simulation_generalized(
  nsim = 100,
  n_train,
  n_test,
  copula,
  init_params,
  fn,
  U_train,
  Z_train,
  X,
  Y_test,
  BSTS_list
)
```

**Arguments**

<code>nsim</code>	Integer, number of simulation replications.
<code>n_train</code>	Integer, number of training observations.
<code>n_test</code>	Integer, number of test observations.
<code>copula</code>	Character, specifying the copula type: "Clayton", "Frank", "Gumbel", "Joe", or "Gaussian".
<code>init_params</code>	Numeric vector, initial parameter values for optimization.
<code>fn</code>	Function, log-likelihood function for parameter estimation.
<code>U_train</code>	Numeric matrix ( $n_{\text{train}} \times D$ ), pseudo-observations for the copula.
<code>Z_train</code>	Numeric array ( $n_{\text{train}} \times D \times M$ ), observed data for each margin and sub-feature.
<code>X</code>	Numeric matrix ( $n_{\text{train}} \times M$ ), risk factors for the dynamic copula parameter.
<code>Y_test</code>	Numeric matrix ( $n_{\text{test}} \times D$ ), true future values for MSE calculation.
<code>BSTS_list</code>	List of length $D$ , each element is a BSTS model for a different margin.

**Value**

A list containing:

<code>optim_results</code>	Results from the optimization process.
<code>theta_sim</code>	Simulated copula parameters across replications.
<code>Y_sim</code>	Simulated final BSTS-based forecasts.
<code>MSE</code>	Mean squared error for each simulation run.

---

 simul\_fun\_generalized\_2d

*A Special Case of simulation\_generalized in 2 Dimensions*


---

## Description

A Special Case of simulation\_generalized in 2 Dimensions

## Usage

```
simul_fun_generalized_2d(
  nsim,
  n_train,
  n_test,
  copula,
  init_params,
  fn,
  u1,
  u2,
  z1_train,
  z2_train,
  X_t,
  y1_test,
  y2_test,
  BSTS_1,
  BSTS_2
)
```

## Arguments

nsim	Integer, number of simulation replications.
n_train	Integer, number of training observations.
n_test	Integer, number of test observations.
copula	Character, specifying the copula type: "Clayton", "Frank", "Gumbel", "Joe", or "Gaussian".
init_params	Numeric vector, initial parameter values for optimization.
fn	Function, log-likelihood function for parameter estimation.
u1	Numeric vector (n_train), first pseudo-observation for the copula.
u2	Numeric vector (n_train), second pseudo-observation for the copula.
z1_train	Numeric matrix (n_train x M), observed data for the first margin.
z2_train	Numeric matrix (n_train x M), observed data for the second margin.
X_t	Numeric matrix (n_train x M), risk factors for the dynamic copula parameter.
y1_test	Numeric vector (n_test), true future values for the first response variable.

<code>y2_test</code>	Numeric vector ( <code>n_test</code> ), true future values for the second response variable.
<code>BSTS_1</code>	Fitted BSTS model for the first response variable.
<code>BSTS_2</code>	Fitted BSTS model for the second response variable.

**Value**

A list containing:

<code>theta_simulated</code>	Simulated copula parameters across replications.
<code>y1_simulated</code>	Simulated values for the first response variable.
<code>y2_simulated</code>	Simulated values for the second response variable.
<code>MSE</code>	Mean squared error for each simulation run.
<code>optim_results</code>	Results from the optimization process.

---

<code>time_all</code>	<i>1950-2022</i>
-----------------------	------------------

---

**Description**

1950-2022

**Usage**

`time_all`

**Format**

An object of class character of length 73.

---

<code>time_test</code>	<i>2004-2022</i>
------------------------	------------------

---

**Description**

2004-2022

**Usage**

`time_test`

**Format**

An object of class character of length 19.

---

time_train	1950-2003
------------	-----------

---

**Description**

1950-2003

**Usage**

time\_train

**Format**

An object of class character of length 54.

---

uu	<i>Pseudo-Observations of BSTS Residuals for Crop Yield Forecasting</i>
----	---

---

**Description**

Pseudo-Observations of BSTS Residuals for Crop Yield Forecasting

**Usage**

uu

**Format**A matrix with dimensions  $(n_{train}, D)$ :**n\_train** Number of time points used in the training set.**D** Number of regions analyzed (Dufferin, Wellington).**Source**

Derived from residuals of BSTS models fitted to crop yield data.

---

 xx\_all

*Maximized Covariates Matrix for Crop Yield Forecasting*


---

**Description**

Maximized Covariates Matrix for Crop Yield Forecasting

**Usage**

xx\_all

**Format**

A three-dimensional array with dimensions  $(n_{train} + n_{test}, M)$ :

**n\_train+n\_test** Number of time points used in the training set.

**M** Number of selected climate covariates used for modeling (cdd, frost\_days, rx1day, tg\_mean, txgt\_25).

**Source**

Derived from historical climate data from ClimateData.ca.

---

 xx\_test

*Maximized Covariates Matrix for Crop Yield Forecasting*


---

**Description**

Maximized Covariates Matrix for Crop Yield Forecasting

**Usage**

xx\_test

**Format**

A three-dimensional array with dimensions  $(n_{test}, M)$ :

**n\_test** Number of time points used in the testing set.

**M** Number of selected climate covariates used for modeling (cdd, frost\_days, rx1day, tg\_mean, txgt\_25).

**Source**

Derived from historical climate data from ClimateData.ca.

xx\_train

*Maximized Covariates Matrix for Crop Yield Forecasting***Description**

Maximized Covariates Matrix for Crop Yield Forecasting

**Usage**

xx\_train

**Format**A three-dimensional array with dimensions  $(n_{train}, M)$ :**n\_test** Number of time points used in the training set.**M** Number of selected climate covariates used for modeling (cdd, frost\_days, rx1day, tg\_mean, txgt\_25).**Source**

Derived from historical climate data from ClimateData.ca.

yy\_all

*Crop Yield Data***Description**

Crop Yield Data

**Usage**

yy\_all

**Format**A matrix with dimensions  $(n_{train} + n_{test}, D)$ :**n\_train+n\_test** Number of time points used in the test set.**D** Number of regions analyzed (Dufferin, Wellington).**Source**

Historical crop yield records from ClimateData.ca.

---

 yy\_test

*Crop Yield Data for Testing in BSTS Models*


---

**Description**

Crop Yield Data for Testing in BSTS Models

**Usage**

yy\_test

**Format**

A matrix with dimensions  $(n_{train}, D)$ :

**n\_train** Number of time points used in the test set.

**D** Number of regions analyzed (Dufferin, Wellington).

**Source**

Historical crop yield records from ClimateData.ca.

---

 yy\_train

*Crop Yield Data for Training in BSTS Models*


---

**Description**

Crop Yield Data for Training in BSTS Models

**Usage**

yy\_train

**Format**

A matrix with dimensions  $(n_{test}, D)$ :

**n\_test** Number of time points used in the train set.

**D** Number of regions analyzed (Dufferin, Wellington).

**Source**

Historical crop yield records from ClimateData.ca.



---

zz_all	<i>Standardized Covariates Array for Crop Yield Forecasting</i>
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---

**Description**

Standardized Covariates Array for Crop Yield Forecasting

**Usage**

zz\_all

**Format**

A three-dimensional array with dimensions  $(n_{train} + n_{test}, D, M)$ :

**n\_train+n\_test** Number of time points used in the training set.

**D** Number of regions analyzed (Dufferin, Wellington).

**M** Number of selected climate covariates used for modeling (cdd, frost\_days, rx1day, tg\_mean, txgt\_25).

**Source**

Derived from historical climate data.

---

zz_test	<i>Standardized Covariates Array for Crop Yield Forecasting</i>
---------	---

---

**Description**

Standardized Covariates Array for Crop Yield Forecasting

**Usage**

zz\_test

**Format**

A three-dimensional array with dimensions  $(n_{test}, D, M)$ :

**n\_test** Number of time points used in the testing set.

**D** Number of regions analyzed (Dufferin, Wellington).

**M** Number of selected climate covariates used for modeling (cdd, frost\_days, rx1day, tg\_mean, txgt\_25).

**Source**

Derived from historical climate data.

---

`zz_train`*Standardized Covariates Array for Crop Yield Forecasting*

---

**Description**

Standardized Covariates Array for Crop Yield Forecasting

**Usage**`zz_train`**Format**

A three-dimensional array with dimensions  $(n_{train}, D, M)$ :

**n\_test** Number of time points used in the training set.

**D** Number of regions analyzed (Dufferin, Wellington).

**M** Number of selected climate covariates used for modeling (cdd, frost\_days, rx1day, tg\_mean, txgt\_25).

**Source**

Derived from historical climate data from ClimateData.ca.

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