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greenbrown

Green vs Brown portfolio dataset

Description

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Daily returns for a green and a brown portfolios constructed following the equal-weighted 10-90 percentile approach.

Usage

```
data(greenbrown)
```

Format

A data frame with 2266 rows and three columns:

DATE Dates ranging from 2014-01-02 to 2024-12-30.

return_green Numeric returns for the green portfolio.

return_brown Numeric returns for the brown portfolio.

Source

Originally data in inst/extdata/green-brown-ptf.xlsx.

```
data("greenbrown")
str(greenbrown)
head(greenbrown)
```

RSDC: Regime-Switching Correlation Models for Portfolio Analysis

RSDC

Description

The **RSDC** package provides a comprehensive framework for modeling, estimating, and forecasting correlation structures in multivariate time series under regime-switching dynamics. It supports both fixed transition probabilities and *time-varying transition probabilities* (TVTP) driven by exogenous variables.

The methodology is particularly suited to empirical asset pricing and portfolio management applications, enabling users to incorporate macroeconomic, financial, or climate-related predictors into the regime dynamics. The package integrates the full workflow — from model estimation to covariance matrix reconstruction and portfolio optimization — in a single, reproducible pipeline.

Main Features

- **Model estimation and filtering:** rsdc_hamilton (Hamilton filter), rsdc_likelihood (likelihood computation), rsdc_estimate (parameter estimation).
- Correlation and covariance forecasting: rsdc_forecast.
- **Portfolio construction:** rsdc_minvar (minimum-variance portfolios), rsdc_maxdiv (maximum-diversification portfolios).
- **Simulation:** rsdc_simulate (simulate TVTP regime-switching series).

Authors

David Ardia and Benjamin Seguin

References

Engle RF (2002). "Dynamic conditional correlation: A simple class of multivariate generalized autoregressive conditional heteroskedasticity models." *Journal of Business & Economic Statistics*, **20**(3), 339–350. doi:10.1198/073500102288618487.

Hamilton JD (1989). "A New Approach to the Economic Analysis of Nonstationary Time Series and the Business Cycle." *Econometrica*, **57**(2), 357–384. doi:10.2307/1912559.

Pelletier D (2006). "Regime switching for dynamic correlations." *Journal of Econometrics*, **131**(1-2), 445–473. doi:10.1016/j.jeconom.2005.01.004.

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rsdc_estimate

Estimate Regime-Switching or Constant Correlation Model (Wrapper)

Description

Unified front-end that dispatches to one of three estimators:

- f_optim() TVTP specification (method = "tvtp").
- f_optim_noX() fixed transition matrix (method = "noX").
- f_optim_const() constant correlation, single regime (method = "const").

Usage

```
rsdc_estimate(
  method = c("tvtp", "noX", "const"),
  residuals,
  N = 2,
  X = NULL,
  out_of_sample = FALSE,
  control = list()
)
```

Arguments

```
method Character. One of "tvtp", "noX", "const".  
Residuals Numeric matrix T \times K. Typically standardized residuals/returns.  
Integer. Number of regimes. Ignored when method = "const".  
X Numeric matrix T \times p of exogenous covariates (required for "tvtp").  
Out_of_sample Logical. If TRUE, a fixed 70/30 split is applied prior to estimation.  
Optional list. Currently forwards do_trace = FALSE and seed = 123 to the backends.
```

Details

- Method selection: match.arg() validates method.
- Inputs: "tvtp" requires non-NULL X; N is ignored for "const".
- **Split:** If out_of_sample = TRUE, the first 70\

Value

```
transition_matrix Estimated transition matrix (1 \times 1 for "const"). correlations Regime lower-triangular correlations. covariances Array of full correlation matrices. log_likelihood Maximized log-likelihood. beta TVTP coefficients (only for "tvtp").
```

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References

Mullen K, Ardia D, Gil D, Windover D, Ulrich J (2011). "DEoptim: An R Package for Global Optimization by Differential Evolution." *Journal of Statistical Software*, **40**(6), 1–26. doi:10.18637/jss.v040.i06.

Hamilton JD (1989). "A New Approach to the Economic Analysis of Nonstationary Time Series and the Business Cycle." *Econometrica*, **57**(2), 357–384. doi:10.2307/1912559.

Pelletier D (2006). "Regime switching for dynamic correlations." *Journal of Econometrics*, **131**(1-2), 445–473. doi:10.1016/j.jeconom.2005.01.004.

See Also

rsdc_hamilton and rsdc_likelihood.

Examples

```
y <- scale(matrix(rnorm(100 * 3), 100, 3))
rsdc_estimate("const", residuals = y)
rsdc_estimate("noX", residuals = y, N = 2)
X <- cbind(1, scale(seq_len(nrow(y))))
rsdc_estimate("tvtp", residuals = y, N = 2, X = X)</pre>
```

rsdc_forecast

Forecast Covariance/Correlation Paths from an RSDC Model

Description

Generates per-period correlation and covariance matrices from a fitted model: "const" (constant correlation), "noX" (fixed transition matrix), or "tvtp" (time-varying transition probabilities).

Usage

```
rsdc_forecast(
  method = c("tvtp", "noX", "const"),
  N,
  residuals,
  X = NULL,
  final_params,
  sigma_matrix,
  value_cols,
  out_of_sample = FALSE,
  control = list()
)
```

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Arguments

Character. One of "tvtp", "noX", "const". method Ν Integer. Number of regimes (ignored for "const"). Numeric matrix $T \times K$ used to compute correlations or run the filter. residuals Optional numeric matrix $T \times p$ (required for "tvtp"). List with fitted parameters (e.g., from rsdc_estimate): must include correlations, final_params and either transition_matrix ("noX") or beta ("tvtp"); include log_likelihood for BIC computation. Numeric matrix $T \times K$ of forecasted standard deviations. sigma_matrix value_cols Character/integer vector of columns in sigma_matrix that define asset order. out_of_sample Logical. If TRUE, use a fixed 70/30 split; otherwise use the whole sample. control Optional list; supports threshold (in (0,1), default 0.7).

Details

- **Forecast horizon:** If out_of_sample = TRUE, filter on the first threshold fraction and forecast on the remainder.
- Correlation paths:
 - "const" empirical correlation of residuals, repeated across time.
 - "noX"/"tvtp" smoothed-probability weighted average of regime correlations.
- Covariance build: Reconstruct R_t from the pairwise vector (columns ordered by combn(K, 2)), set $D_t = \text{diag}(\sigma_{t,1}, \dots, \sigma_{t,K})$, and $\Sigma_t = D_t R_t D_t$.
- **BIC:** Parameter count k is N * ncol(X) + N * K * (K 1) / 2 for "tvtp", N * (N 1) + N * K * (K 1) / 2 for "noX", and K * (K 1) / 2 for "const".

Value

```
smoothed_probs N\times T^* smoothed probabilities ("noX"/"tvtp" only). 
 sigma_matrix T^*\times K slice aligned to the forecast horizon. 
 cov_matrices List of K\times K covariance matrices \Sigma_t=D_tR_tD_t. 
 predicted_correlations T^*\times {K\choose 2} pairwise correlations in combn(K, 2) order. 
 BIC Bayesian Information Criterion \mathrm{BIC}=\log(n)\,k-2\,\ell. 
 y T^*\times K residual matrix aligned to the forecast horizon.
```

See Also

```
rsdc_hamilton, rsdc_estimate, rsdc_minvar, rsdc_maxdiv
```

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Examples

rsdc_hamilton

Hamilton Filter (Fixed P or TVTP)

Description

Runs the Hamilton (1989) filter for a multivariate regime-switching *correlation* model. Supports either a fixed (time-invariant) transition matrix P or time-varying transition probabilities (TVTP) built from exogenous covariates X via a logistic link. Returns filtered/smoothed regime probabilities and the log-likelihood.

Usage

```
rsdc_hamilton(y, X = NULL, beta = NULL, rho_matrix, K, N, P = NULL)
```

Arguments

у	Numeric matrix $T \times K$ of observations (e.g., standardized residuals/returns). Columns are treated as mean-zero with unit variance; only the correlation structure is modeled.
X	Optional numeric matrix $T\times p$ of covariates for TVTP. Required if beta is supplied.
beta	Optional numeric matrix $N \times p$. TVTP coefficients; row i governs persistence of regime i via plogis(X[t,] %*% beta[i,]).
rho_matrix	Numeric matrix $N \times C$ of regime correlation parameters, where $C = K(K-1)/2$. Each row is the lower-triangular part (by lower.tri) of a regime's correlation matrix.
K	Integer. Number of observed series (columns of y).
N	Integer. Number of regimes.
Р	Optional $N \times N$ fixed transition matrix. Used only when X or beta is NULL.

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Details

- Correlation rebuild: For regime m, a correlation matrix R_m is reconstructed from rho_matrix[m,] (lower-triangular fill + symmetrization). Non-PD proposals are penalized.
- Transition dynamics:
 - Fixed P: If X or beta is missing, a constant P is used (user-provided via P; otherwise uniform 1/N rows).
 - *TVTP*: With X and beta, diagonal entries use plogis(X[t,] %*% beta[i,]). Off-diagonals are equal and sum to $1 p_{ii,t}$. For N = 1, $P_t = [1]$.
- Numerical safeguards: A small ridge is added before inversion; if filtering degenerates at a time step, log_likelihood = -Inf is returned.

Value

A list with:

```
filtered_probs N \times T matrix of filtered probabilities \Pr(S_t = j \mid \Omega_t). smoothed_probs N \times T matrix of smoothed probabilities \Pr(S_t = j \mid \Omega_T). log_likelihood Scalar log-likelihood of the model given y.
```

Note

TVTP uses a logistic link on the diagonal; off-diagonals are equal by construction.

References

Hamilton JD (1989). "A New Approach to the Economic Analysis of Nonstationary Time Series and the Business Cycle." *Econometrica*, **57**(2), 357–384. doi:10.2307/1912559.

See Also

rsdc_likelihood and rsdc_estimate.

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rsdc_likelihood

Negative Log-Likelihood for Regime-Switching Correlation Models

Description

Computes the negative log-likelihood for a multivariate *correlation-only* regime-switching model, with either a fixed (time-invariant) transition matrix or time-varying transition probabilities (TVTP) driven by exogenous covariates. Likelihood evaluation uses the Hamilton (1989) filter.

Usage

```
rsdc_likelihood(params, y, exog = NULL, K, N)
```

Arguments

params

Numeric vector of model parameters packed as:

- No exogenous covariates (exog = NULL): first N(N-1) transition parameters (for the fixed transition matrix), followed by $N \times K(K-1)/2$ correlation parameters, stacked *row-wise by regime* in lower.tri order.
- With exogenous covariates (exog provided): first $N \times p$ TVTP coefficients (beta, row i corresponds to regime i), followed by $N \times K(K-1)/2$ correlation parameters, stacked *row-wise by regime* in lower.tri order.

Numeric matrix $T \times K$ of observations (e.g., standardized residuals). Columns are treated as mean-zero, unit-variance; only correlation is modeled.

Optional numeric matrix $T \times p$ of exogenous covariates. If supplied, a TVTP specification is used.

K Integer. Number of observed series (columns of y).

N Integer. Number of regimes.

Details

exog

• Transition dynamics:

- Fixed P (no exog): params begins with transition parameters. For N=2, the implementation maps them to $P=\begin{pmatrix} p_{11} & 1-p_{11} \\ 1-p_{22} & p_{22} \end{pmatrix}$.
- TVTP: with exog, diagonal persistence is $p_{ii,t} = \operatorname{logit}^{-1}(X_t^{\top}\beta_i)$; off-diagonals are equal and sum to $1 p_{ii,t}$.

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• Correlation build: per regime, the lower-triangular vector is filled into a symmetric correlation matrix. Non-positive-definite proposals or $|\rho| \ge 1$ are penalized via a large objective value.

• Evaluation: delegates to rsdc_hamilton; if the filter returns log_likelihood = -Inf, a large penalty is returned.

Value

Numeric scalar: the *negative* log-likelihood to be minimized by an optimizer.

Note

The function is written for use inside optimizers; it performs inexpensive validation and returns large penalties for invalid parameterizations instead of stopping with errors.

See Also

```
rsdc_hamilton (filter), optim, and DEoptim
```

```
# Small toy example (N = 2, K = 3), fixed P (no exog)
set.seed(1)
T <- 40; K <- 3; N <- 2
y <- scale(matrix(rnorm(T * K), T, K), center = TRUE, scale = TRUE)
# Pack parameters: trans (p11, p22), then rho by regime (lower-tri order)
p11 <- 0.9; p22 <- 0.8
rho1 <- c(0.10, 0.05, 0.00) # (2,1), (3,1), (3,2)
rho2 <- c(0.60, 0.40, 0.30)
params <- c(p11, p22, rho1, rho2)
nll <- rsdc_likelihood(params, y = y, exog = NULL, K = K, N = N)</pre>
# TVTP example: add X and beta (pack beta row-wise, then rho)
X <- cbind(1, scale(seq_len(T)))</pre>
beta <- rbind(c(1.2, 0.0),
              c(0.8, -0.1))
params_tvtp <- c(as.vector(t(beta)), rho1, rho2)</pre>
nll_tvtp \leftarrow rsdc_likelihood(params_tvtp, y = y, exog = X, K = K, N = N)
nll_tvtp
```

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rsdc_maxdiv

Maximum-Diversification Portfolio (Rolling Weights)

Description

Computes rolling maximum-diversification (MaxDiv) portfolio weights from a sequence of perperiod covariance matrices implied by forecasted volatilities and correlations. Falls back to equal weights if the nonlinear solver fails.

Usage

```
rsdc_maxdiv(sigma_matrix, value_cols, predicted_corr, y, long_only = TRUE)
```

Arguments

```
sigma_matrix Numeric matrix T \times K of forecasted standard deviations. Value_cols Character/integer vector naming columns in sigma_matrix (asset order). Predicted_corr Numeric matrix T \times {K \choose 2} of pairwise correlations in combn(K, 2) column order. Numeric matrix T \times K of asset returns (for realized stats). Logical. If TRUE, impose w \geq 0 and \sum_i w_i = 1; otherwise bounds are -1 \leq w_i \leq 1 with \sum_i w_i = 1.
```

Details

- Covariance build: For each t, reconstruct R_t from the pairwise vector; set $D_t = \text{diag}(\sigma_{t,1}, \dots, \sigma_{t,K})$ and $\Sigma_t = D_t R_t D_t$.
- Objective (MaxDiv): maximize $\mathrm{DR}(w) = \frac{\sum_i w_i \sigma_{t,i}}{\sqrt{w^\top \Sigma_t w}}$ subject to $\sum_i w_i = 1$ and bounds on w. Implemented by minimizing the negative ratio.
- Solver: Rsolnp::solnp with equality $\sum_i w_i = 1$ and bounds by long_only; on error, weights default to 1/K.

Value

```
weights T \times K matrix of weights. returns Vector of realized portfolio returns sum(y[t,] * weights[t,]). diversification_ratios Vector of realized diversification ratios. mean_diversification Average diversification ratio. K Number of assets. assets Asset names. volatility Standard deviation of realized portfolio returns.
```

See Also

```
rsdc_minvar, solnp
```

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Examples

```
# Toy example with K = 3
if (requireNamespace("Rsolnp", quietly = TRUE)) {
 T <- 50; K <- 3
 set.seed(42)
 vols <- matrix(0.2 + 0.05*abs(sin(seq_len(T)/7)), T, K)
 colnames(vols) <- paste0("A", 1:K)</pre>
 # simple, stationary correlations (order: (2,1), (3,1), (3,2))
 pred_corr <- cbind(rep(0.20, T), rep(0.10, T), rep(0.05, T))
 rets <- matrix(rnorm(T*K, sd = 0.01), T, K); colnames(rets) <- colnames(vols)
 mx <- rsdc_maxdiv(sigma_matrix = vols,</pre>
                    value_cols
                                  = colnames(vols),
                    predicted_corr = pred_corr,
                                 = rets,
                    long_only
                                 = TRUE)
 head(mx$weights)
 mx$mean_diversification
}
```

rsdc_minvar

Minimum-Variance Portfolio (Rolling Weights)

Description

Computes rolling minimum-variance (MV) portfolio weights from a sequence of per-period covariance matrices implied by forecasted volatilities and pairwise correlations. Supports long-only or unconstrained MV. If the QP solver fails at a time step, the routine falls back to equal weights.

Usage

```
rsdc_minvar(sigma_matrix, value_cols, predicted_corr, y, long_only = TRUE)
```

Arguments

sigma_matrix	Numeric matrix $T \times K$ of forecasted $\emph{volatilities}$ (standard deviations), one column per asset.
value_cols	Character or integer vector giving the columns in sigma_matrix to use as assets (order defines the asset order).
predicted_corr	Numeric matrix $T \times P$ of pairwise correlations, where $P = {K \choose 2}$ and the columns correspond to combn(K, 2) order.
У	Numeric matrix $T \times K$ of asset returns aligned with sigma_matrix. Used only to compute the realized portfolio volatility.
long_only	Logical. If TRUE (default), imposes long-only MV with the full-investment constraint $\sum_i w_i = 1$ and $w_i \geq 0$. If FALSE, solves unconstrained MV with only $\sum_i w_i = 1$.

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Details

- Covariance build: For each t, a correlation matrix R_t is reconstructed ... Let $D_t = \operatorname{diag}(\sigma_{t,1}, \dots, \sigma_{t,K})$ and $\Sigma_t = D_t R_t D_t$.
- Optimization: Minimize $\frac{1}{2}w^{\top}\Sigma_t w$ subject to $\mathbf{1}^{\top}w=1$ and, if long_only, $w\geq 0$ (solved with quadprog::solve.QP).
- Failure handling: If the QP fails at time (t), weights default to equal allocation $(w_i = 1/K)$.

Value

```
An object of class "minvar_portfolio":
```

```
weights T \times K matrix of MV weights (one row per time).
```

cov_matrices List of length T with the per-period $K \times K$ covariance matrices.

volatility Realized standard deviation of portfolio returns (see Note on units).

- **y** The input y matrix (coerced to $T \times K$).
- **K** Number of assets.

Note on units

The realized portfolio return at time (t) is computed as sum(y[t,] * weights[t,]) / 100. This assumes y is expressed in \ remove the / 100 in the implementation or convert inputs accordingly.

See Also

```
rsdc_maxdiv (maximum diversification), solve.QP
```

```
# Toy example with K = 3
T <- 50; K <- 3
set.seed(42)
vols <- matrix(0.2 + 0.05*abs(sin(seq_len(T)/7)), T, K)
colnames(vols) <- paste0("A", 1:K)</pre>
# simple, stationary correlations
pred_corr <- cbind(rep(0.20, T), rep(0.10, T), rep(0.05, T)) # order: (2,1), (3,1), (3,2)
rets <- matrix(rnorm(T*K, sd = 0.01), T, K); colnames(rets) <- colnames(vols)</pre>
mv <- rsdc_minvar(sigma_matrix = vols,</pre>
                  value_cols
                               = colnames(vols),
                  predicted_corr= pred_corr,
                               = rets,
                  long_only
                                 = TRUE)
head(mv$weights)
mv$volatility
```

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rsdc_simulate

Simulate Multivariate Regime-Switching Data (TVTP)

Description

Simulates a multivariate time series from a regime-switching model with *time-varying transition* probabilities (TVTP) driven by covariates X. Transition probabilities are generated via a multinomial logistic (softmax) link; observations are drawn from regime-specific Gaussian distributions.

Usage

rsdc_simulate(n, X, beta, mu, sigma, N, seed = NULL)

Arguments

n	Integer. Number of time steps to simulate.
X	Numeric matrix $n \times p$ of covariates used to form the transition probabilities. Row X[t,] corresponds to covariates available at time t. Only rows 1:(n-1) are used to transition from t-1 to t.
beta	Numeric array $N \times N \times p$. Softmax coefficients for the multinomial transition model; beta[i, j,] parameterizes the transition from state i to state j .
mu	Numeric matrix $N \times K$. Regime-specific mean vectors.
sigma	Numeric array $K \times K \times N$. Regime-specific covariance (here, correlation/variance) matrices; each $K \times K$ slice must be symmetric positive definite.
N	Integer. Number of regimes.
seed	Optional integer. If supplied, sets the RNG seed for reproducibility.

Details

- Initial state and first draw: The initial regime S_1 is sampled uniformly; the first observation y_1 is drawn from $\mathcal{N}(\mu_{S_1}, \Sigma_{S_1})$.
- TVTP via softmax: For $t \ge 2$, the row i of P_t is

$$P_t(i,j) = \frac{\exp\left(X_{t-1}^\top \beta_{i,j}\right)}{\sum_{h=1}^N \exp\left(X_{t-1}^\top \beta_{i,h}\right)} \,,$$

computed with log-sum-exp stabilization.

• Sampling: Given S_{t-1} , draw S_t from the categorical distribution with probabilities $P_t(S_{t-1}, \cdot)$ and $y_t \sim \mathcal{N}(\mu_{S_t}, \Sigma_{S_t})$.

Value

A list with:

states Integer vector of length n; the simulated regime index at each time.

observations Numeric matrix $n \times K$; the simulated observations.

transition_matrices Array $N \times N \times n$; the transition matrix P_t used at each time step (with P_1 undefined by construction; see Details).

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Note

Requires **mvtnorm** for multivariate normal sampling (called as mvtnorm::rmvnorm).

See Also

```
rsdc_hamilton (filter/evaluation), rsdc_estimate (estimators), rsdc_forecast (forecasting)
```

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