# Package 'wqtrends'

July 9, 2025

Title Assess Water Quality Trends with Generalized Additive Models

Version 1.5.1

Date 2025-07-09

**Description** Assess Water Quality Trends for Long-Term Monitoring Data in Estuaries using Generalized Additive Models following Wood (2017) <doi:10.1201/9781315370279> and Error Propagation with Mixed-Effects Meta-

Analysis following Sera et al. (2019) <doi:10.1002/sim.8362>.

Methods are available for model fitting, assessment of fit, annual and seasonal trend tests, and visualization of results.

**Depends** R (>= 3.5)

**Imports** dplyr, ggplot2, lubridate, mgcv, mixmeta, plotly, purrr, tibble, tidyr, viridisLite

License CC0

**Encoding** UTF-8

LazyData true

RoxygenNote 7.3.2

BugReports https://github.com/tbep-tech/wqtrends/issues

Suggests testthat (>= 2.1.0), covr, english, knitr, rmarkdown

VignetteBuilder knitr

## NeedsCompilation no

Author Marcus Beck [aut, cre] (ORCID: <https://orcid.org/0000-0002-4996-0059>), Perry de Valpine [aut], Rebecca Murphy [aut], Ian Wren [aut], Ariella Chelsky [aut], Melissa Foley [aut] (ORCID: <https://orcid.org/0000-0002-5832-6404>), David Senn [aut] (ORCID: <https://orcid.org/0000-0002-4869-3550>)

Maintainer Marcus Beck <mbeck@tbep.org>

**Repository** CRAN

Date/Publication 2025-07-09 20:50:02 UTC

## Contents

| 2 | lz_avgseason      |     |   | 2  |
|---|-------------------|-----|---|----|
| 8 | lz_backtrans      |     |   | 3  |
| 8 | lz_fit            |     |   | 4  |
| 8 | lz_gam            |     |   | 5  |
| 8 | lz_metseason      |     |   | 6  |
| 2 | lz_mixmeta        |     |   | 7  |
| 8 | lz_perchg         |     |   | 8  |
| 8 | lz_prd            |     |   | 9  |
| 2 | lz_prdday         |     |   | 9  |
| 8 | lz_prdmatrix      |     |   | 10 |
| 8 | lz_pvalformat     |     |   | 11 |
|   | lz_smooth         |     |   |    |
| 8 | lz_sumstats       |     |   | 12 |
|   | lz_sumtrndseason  |     |   | 14 |
|   | lz_trans          |     |   |    |
|   | lz_trndseason     |     |   |    |
|   | wdat              |     |   |    |
|   | ow_metseason      |     |   |    |
|   | ow_mettrndseason  |     |   |    |
|   | ow_perchg         |     |   |    |
|   | ow_prd3d          |     |   |    |
|   | ow_prddoy         |     |   |    |
|   | ow_prdseason      |     |   |    |
|   | ow_prdseries      |     |   |    |
|   | ow_sumtrndseason  |     |   |    |
|   | ow_sumtrndseason2 |     |   |    |
| S | ow_trndseason     | ••• | • | 30 |
|   |                   |     |   | 32 |
|   |                   |     |   |    |

## Index

anlz\_avgseason Ex

Extract period (seasonal) averages from fitted GAM

## Description

Extract period (seasonal) averages from fitted GAM

## Usage

```
anlz_avgseason(mod, doystr = 1, doyend = 364, yromit = NULL)
```

## Arguments

| mod    | input model object as returned by anlz_gam                   |
|--------|--|
| doystr | numeric indicating start Julian day for extracting averages  |
| doyend | numeric indicating ending Julian day for extracting averages |
| yromit | optional numeric vector for years to omit from the output    |

## anlz\_backtrans

## Value

A data frame of period averages

#### Examples

```
library(dplyr)
# data to model
tomod <- rawdat %>%
filter(station %in% 34) %>%
filter(param %in% 'chl') %>%
filter(yr > 2015)
mod <- anlz_gam(tomod, trans = 'log10')
anlz_avgseason(mod, doystr = 90, doyend = 180)</pre>
```

anlz\_backtrans

Back-transform response variable

#### Description

Back-transform response variable after fitting GAM

#### Usage

anlz\_backtrans(dat)

## Arguments

dat input data with trans argument

## Details

dat can be output from anlz\_trans or anlz\_prd

#### Value

dat with the value column back-transformed using info from the trans column

```
library(dplyr)
```

```
tomod <- rawdat %>%
  filter(station %in% 34) %>%
  filter(param %in% 'chl')
dat <- anlz_trans(tomod, trans = 'log10')
backtrans <- anlz_backtrans(dat)
head(backtrans)</pre>
```

```
mod <- anlz_gam(tomod, trans = 'log10')
dat <- anlz_prd(mod)
backtrans <- anlz_backtrans(dat)
head(backtrans)</pre>
```

anlz\_fit

Return summary statistics for GAM fits

#### Description

Return summary statistics for GAM fits

#### Usage

anlz\_fit(mod)

#### Arguments

mod

input model object as returned by anlz\_gam

#### Details

Results show the overall summary of the model as Akaike Information Criterion (AIC), the generalized cross-validation score (GCV), and the R2 values. Lower values for AIC and GCV and higher values for R2 indicate improved model fit.

## Value

A data.frame with summary statistics for GAM fits

## Examples

```
library(dplyr)
# data to model
tomod <- rawdat %>%
  filter(station %in% 34) %>%
  filter(param %in% 'chl')
mod <- anlz_gam(tomod, trans = 'log10')
anlz_fit(mod)</pre>
```

4

anlz\_gam

#### Description

Fit a generalized additive model to a water quality time series

#### Usage

```
anlz_gam(moddat, kts = NULL, ...)
```

## Arguments

| moddat | input raw data, one station and paramater   |
|--------|---|
| kts    | optional numeric vector for the upper limit for the number of knots in the term s(cont_year), see details             |
|        | additional arguments passed to other methods, i.e., trans = 'log10' (default) or trans = 'ident' passed to anlz_trans |

#### Details

The model structure is as follows:

**model S:** chl ~ s(cont\_year, k = large)

The cont\_year vector is measured as a continuous numeric variable for the annual effect (e.g., January 1st, 2000 is 2000.0, July 1st, 2000 is 2000.5, etc.) and doy is the day of year as a numeric value from 1 to 366. The function s models cont\_year as a smoothed, non-linear variable. The optimal amount of smoothing on cont\_year is determined by cross-validation as implemented in the mgcv package and an upper theoretical upper limit on the number of knots for k should be large enough to allow sufficient flexibility in the smoothing term. The upper limit of k was chosen as 12 times the number of years for the input data. If insufficient data are available to fit a model with the specified k, the number of knots is decreased until the data can be modelled, e.g., 11 times the number of years, 10 times the number of years, etc.

## Value

a gam model object

```
library(dplyr)
tomod <- rawdat %>%
  filter(station %in% 34) %>%
  filter(param %in% 'chl')
anlz_gam(tomod, trans = 'log10')
```

anlz\_metseason

## Description

Extract period (seasonal) metrics from fitted GAM

## Usage

```
anlz_metseason(
   mod,
   metfun = mean,
   doystr = 1,
   doyend = 364,
   nsim = 10000,
   yromit = NULL,
   ...
)
```

#### Arguments

| mod    | input model object as returned by anlz_gam                           |
|--------|--|
| metfun | function input for metric to calculate, e.g., mean, var, max, etc    |
| doystr | numeric indicating start Julian day for extracting averages          |
| doyend | numeric indicating ending Julian day for extracting averages         |
| nsim   | numeric indicating number of random draws for simulating uncertainty |
| yromit | optional numeric vector for years to omit from the output            |
|        | additional arguments passed to metfun, e.g., na.rm = TRUE            |

#### Details

This function estimates a metric of interest for a given seasonal period each year using results from a fitted GAM (i.e., from anlz\_gam). The estimates are based on the predicted values for each seasonal period, with uncertainty of the metric based on repeated sampling of the predictions following uncertainty in the model coefficients.

## Value

A data frame of period metrics

## anlz\_mixmeta

library(dplyr)

## Examples

```
# data to model
tomod <- rawdat %>%
filter(station %in% 34) %>%
filter(param %in% 'chl') %>%
filter(yr > 2015)
mod <- anlz_gam(tomod, trans = 'log10')
anlz_metseason(mod, mean, doystr = 90, doyend = 180, nsim = 100)
```

anlz\_mixmeta Fit a mixed meta-analysis regression model of trends

## Description

Fit a mixed meta-analysis regression model of trends

## Usage

anlz\_mixmeta(metseason, yrstr = 2000, yrend = 2019)

## Arguments

| metseason | output from anlz_metseason |
|-----------|----------------------------|
| yrstr     | numeric for starting year  |
| yrend     | numeric for ending year    |

#### Details

Parameters are not back-transformed if the original GAM used a transformation of the response variable

## Value

A list of mixmeta fitted model objects

```
library(dplyr)
```

```
# data to model
tomod <- rawdat %>%
filter(station %in% 34) %>%
filter(param %in% 'chl') %>%
filter(yr > 2015)
```

```
mod <- anlz_gam(tomod, trans = 'log10')
metseason <- anlz_metseason(mod, doystr = 90, doyend = 180)
anlz_mixmeta(metseason, yrstr = 2016, yrend = 2019)</pre>
```

anlz\_perchg

Estimate percent change trends from GAM results for selected time periods

## Description

Estimate percent change trends from GAM results for selected time periods

## Usage

anlz\_perchg(mod, baseyr, testyr)

## Arguments

| mod    | input model object as returned by anlz_gam |
|--------|--|
| baseyr | numeric vector of starting years           |
| testyr | numeric vector of ending years             |

## Details

Working components of this function were taken from the gamDiff function in the baytrends package.

## Value

A data frame of summary results for change between the years.

## Examples

```
library(dplyr)
# data to model
tomod <- rawdat %>%
filter(station %in% 34) %>%
filter(param %in% 'chl')
mod <- anlz_gam(tomod, trans = 'log10')
anlz_perchg(mod, baseyr = 1990, testyr = 2016)</pre>
```

8

anlz\_prd

## Description

Get predicted data from fitted GAMs across period of observation

#### Usage

```
anlz_prd(mod, annual = FALSE)
```

## Arguments

| mod    | input model object as returned by anlz_gam                                     |
|--------|--|
| annual | logical indicating if predictions only for the cont_year smoother are returned |

## Value

a data.frame with predictions

#### Examples

```
library(dplyr)
# data to model
tomod <- rawdat %>%
filter(station %in% 34) %>%
filter(param %in% 'chl') %>%
filter(yr > 2015)
mod <- anlz_gam(tomod, trans = 'log10')
anlz_prd(mod)</pre>
```

| anlz_prdday | Get predicted data from fitted GAMs across period of observation, ev- |
|-------------|---|
|             | ery day   |

## Description

Get predicted data from fitted GAMs across period of observation, every day

## Usage

anlz\_prdday(mod)

#### Arguments

mod

input model object as returned by anlz\_gam

## Value

a data.frame with predictions

## Examples

```
library(dplyr)
# data to model
tomod <- rawdat %>%
  filter(station %in% 34) %>%
  filter(param %in% 'chl') %>%
  filter(yr > 2015)
mod <- anlz_gam(tomod, trans = 'log10')
anlz_prdday(mod)</pre>
```

anlz\_prdmatrix Get prediction matrix for a fitted GAM

## Description

Get prediction matrix for a fitted GAM

## Usage

```
anlz_prdmatrix(mod, doystr = 1, doyend = 364, avemat = FALSE)
```

#### Arguments

| mod    | input model object as returned by anlz_gam  |
|--------|---|
| doystr | numeric indicating start Julian day for extracting averages   |
| doyend | numeric indicating ending Julian day for extracting averages  |
| avemat | logical indicating if the prediction matrix is to be passed to anlz_metseason (default) or anlz_avgseason |

## Details

Used internally by anlz\_metseason, not to be used by itself

#### Value

a data.frame with predictors to use with the fitted GAM

## anlz\_pvalformat

library(dplyr)

## Examples

```
# data to model
tomod <- rawdat %>%
filter(station %in% 34) %>%
filter(param %in% 'chl') %>%
filter(yr > 2015)
mod <- anlz_gam(tomod, trans = 'log10')
anlz_prdmatrix(mod, doystr = 90, doyend = 180)
```

anlz\_pvalformat Format p-values for show functions

## Description

Format p-values for show functions

#### Usage

anlz\_pvalformat(x)

#### Arguments

х

numeric input p-value

#### Value

p-value formatted as a text string, one of p < 0.001, 'p < 0.01', p < 0.05, or ns for not significant

## Examples

anlz\_pvalformat(0.05)

anlz\_smooth Return summary statistics for smoothers of GAMs

## Description

Return summary statistics for smoothers of GAMs

## Usage

anlz\_smooth(mod)

#### Arguments

mod

input model object as returned by anlz\_gam

#### Details

Results show the individual effects of the modelled components of each model as the estimated degrees of freedom (edf), the reference degrees of freedom (Ref.df), the test statistic (F), and significance of the component (p-value). The significance of the component is in part based on the difference between edf and Ref.df.

## Value

a data. frame with summary statistics for smoothers in each GAM

#### Examples

```
library(dplyr)
# data to model
tomod <- rawdat %>%
filter(station %in% 34) %>%
filter(param %in% 'chl')
mod <- anlz_gam(tomod, trans = 'log10')
anlz_smooth(mod)</pre>
```

anlz\_sumstats

Retrieve summary statistics for seasonal metrics and trend results

## Description

Retrieve summary statistics for seasonal metrics and trend results

#### Usage

```
anlz_sumstats(
    mod,
    metfun = mean,
    doystr = 1,
    doyend = 364,
    yrstr = 2000,
    yrend = 2019,
    yromit = NULL,
    nsim = 10000,
    confint = 0.95,
    useave = FALSE,
    ...
)
```

#### anlz\_sumstats

#### Arguments

| mod     | input model object as returned by anlz_gam  |
|---------|---|
| metfun  | function input for metric to calculate, e.g., mean, var, max, etc   |
| doystr  | numeric indicating start Julian day for extracting averages   |
| doyend  | numeric indicating ending Julian day for extracting averages  |
| yrstr   | numeric for starting year for trend model, see details  |
| yrend   | numeric for ending year for trend model, see details  |
| yromit  | optional numeric vector for years to omit from the plot, see details  |
| nsim    | numeric indicating number of random draws for simulating uncertainty  |
| confint | numeric from zero to one indicating confidence interval level for summarizing<br>the mixed-effects meta-analysis model, see details |
| useave  | logical indicating if anlz_avgseason is used for the seasonal metric calculation, see details                                       |
|         | additional arguments passed to metfun, e.g., na.rm = TRUE   |

## Details

This function is primarily for convenience to return summary statistics of a fitted GAM from anlz\_gam.

Note that confint only applies to the summary and coeffs list outputs. It does not apply to the metseason list element output that is default set to 95

Set useave = T to speed up calculations if metfun = mean. This will use anlz\_avgseason to estimate the seasonal summary metrics using a non-stochastic equation.

#### Value

A list object with named elements:

- mixmet: mixmeta object of the fitted mixed-effects meta-analysis trend model
- metseason: tibble object of the fitted seasonal metrics as returned by anlz\_metseason or anlz\_avgseason
- summary: summary of the mixmet object
- coeffs: tibble object of the slope estimate coefficients from the mixmet model. An approximately linear slope estimate will be included as slope.approx if trans = 'log10' for the GAM used in mod.

```
library(dplyr)
```

```
# data to model
tomod <- rawdat %>%
filter(station %in% 34) %>%
filter(param %in% 'chl') %>%
filter(yr > 2015)
```

```
mod <- anlz_gam(tomod, trans = 'log10')
anlz_sumstats(mod, metfun = mean, doystr = 90, doyend = 180, yrstr = 2016,
yrend = 2019, nsim = 100)</pre>
```

anlz\_sumtrndseason Estimate seasonal rates of change based on average estimates for multiple window widths

#### Description

Estimate seasonal rates of change based on average estimates for multiple window widths

#### Usage

```
anlz_sumtrndseason(
  mod,
  doystr = 1,
  doyend = 364,
  justify = c("center", "left", "right"),
  win = 5:15,
  yromit = NULL
)
```

#### Arguments

| mod input model object as returned by anlz_gam                              |    |
|---|----|
| doystr numeric indicating start Julian day for extracting averages          |    |
| doyend numeric indicating ending Julian day for extracting averages         |    |
| justify chr string indicating the justification for the trend window        |    |
| win numeric vector indicating number of years to use for the trend wind     | ow |
| yromit optional numeric vector for years to omit from the plot, see details |    |

#### Details

The optional yromit vector can be used to omit years from the plot and trend assessment. This may be preferred if seasonal estimates for a given year have very wide confidence intervals likely due to limited data, which can skew the trend assessments.

This function is a wrapper to anlz\_trndseason to loop across values in win, using useave = TRUE for quicker calculation of average seasonal metrics. It does not work with any other seasonal metric calculations.

#### Value

A data frame of slope estimates and p-values for each year

## anlz\_trans

#### See Also

Other analyze: anlz\_trans(), anlz\_trndseason()

#### Examples

```
library(dplyr)
# data to model
tomod <- rawdat %>%
  filter(station %in% 34) %>%
  filter(param %in% 'chl') %>%
  filter(yr > 2015)
mod <- anlz_gam(tomod, trans = 'log10')
anlz_sumtrndseason(mod, doystr = 90, doyend = 180, justify = 'center', win = 2:3)</pre>
```

anlz\_trans

Transform response variable

## Description

Transform response variable prior to fitting GAM

#### Usage

```
anlz_trans(moddat, trans = c("log10", "ident"))
```

## Arguments

| moddat | input raw data, one station and paramater   |
|--------|---|
| trans  | chr string indicating desired type of transformation, one of log10 or ident (no transformation) |

#### Value

moddat with the value column transformed as indicated

## See Also

Other analyze: anlz\_sumtrndseason(), anlz\_trndseason()

```
library(dplyr)
tomod <- rawdat %>%
filter(station %in% 34) %>%
filter(param %in% 'chl')
anlz_trans(tomod, trans = 'log10')
```

anlz\_trndseason

#### Description

Estimate rates of change based on seasonal metrics

#### Usage

```
anlz_trndseason(
  mod,
  metfun = mean,
  doystr = 1,
  doyend = 364,
  justify = c("center", "left", "right"),
  win = 5,
  nsim = 10000,
  yromit = NULL,
  useave = FALSE,
  ...
)
```

#### Arguments

| mod     | input model object as returned by anlz_gam  |
|---------|---|
| metfun  | function input for metric to calculate, e.g., mean, var, max, etc                             |
| doystr  | numeric indicating start Julian day for extracting averages                                   |
| doyend  | numeric indicating ending Julian day for extracting averages                                  |
| justify | chr string indicating the justification for the trend window                                  |
| win     | numeric indicating number of years to use for the trend window, see details                   |
| nsim    | numeric indicating number of random draws for simulating uncertainty                          |
| yromit  | optional numeric vector for years to omit from the output                                     |
| useave  | logical indicating if anlz_avgseason is used for the seasonal metric calculation, see details |
|         | additional arguments passed to metfun, e.g., na.rm = TRUE                                     |

#### Details

Trends are based on the slope of the fitted linear trend within the window, where the linear trend is estimated using a meta-analysis regression model (from anlz\_mixmeta) for the seasonal metrics (from anlz\_metseason). Set useave = T to speed up calculations if metfun = mean. This will use anlz\_avgseason to estimate the seasonal summary metrics using a non-stochastic equation.

Note that for left and right windows, the exact number of years in win is used. For example, a left-centered window for 1990 of ten years will include exactly ten years from 1990, 1991, ... ,

#### rawdat

1999. The same applies to a right-centered window, e.g., 1990 would include 1981, 1982, ..., 1990 (if those years have data). However, for a centered window, picking an even number of years for the window width will create a slightly off-centered window because it is impossible to center on an even number of years. For example, if win = 8 and justify = 'center', the estimate for 2000 will be centered on 1997 to 2004 (three years left, four years right, eight years total). Centering for window widths with an odd number of years will always create a symmetrical window, i.e., if win = 7 and justify = 'center', the estimate for 2000 will be centered on 1997 and 2003 (three years left, three years right, seven years total).

The optional yromit vector can be used to omit years from the trend assessment. This may be preferred if seasonal estimates for a given year have very wide confidence intervals likely due to limited data, which can skew the trend assessments.

## Value

A data frame of slope estimates and p-values for each year

#### See Also

Other analyze: anlz\_sumtrndseason(), anlz\_trans()

#### Examples

library(dplyr)

```
# data to model
tomod <- rawdat %>%
filter(station %in% 34) %>%
filter(param %in% 'chl') %>%
filter(yr > 2015)
mod <- anlz_gam(tomod, trans = 'log10')
anlz_trndseason(mod, doystr = 90, doyend = 180, justify = 'center', win = 4)
```

rawdat

Raw data from San Francisco Estuary (South Bay)

#### Description

Raw data from San Francisco Estuary (South Bay)

#### Usage

rawdat

## Format

A data.frame object with 12411 rows and 8 columns

date Date station int param chr value num doy num cont\_year num yr num mo Ord.factor

## Details

Data from datprc object in https://github.com/fawda123/SFbaytrends

| show_metseason | Plot period (seasonal) averages from fitted GAM |
|----------------|---|
|----------------|---|

## Description

Plot period (seasonal) averages from fitted GAM

## Usage

```
show_metseason(
 mod,
 metfun = mean,
 doystr = 1,
 doyend = 364,
 yrstr = 2000,
 yrend = 2019,
 yromit = NULL,
 ylab,
 width = 0.9,
  size = 1.5,
  seascol = "deepskyblue3",
  trndcol = "pink",
  nsim = 10000,
 useave = FALSE,
 base_size = 11,
 xlim = NULL,
 ylim = NULL,
  . . .
)
```

18

#### Arguments

| mod       | input model object as returned by anlz_gam  |
|-----------|---|
| metfun    | function input for metric to calculate, e.g., mean, var, max, etc                             |
| doystr    | numeric indicating start Julian day for extracting averages                                   |
| doyend    | numeric indicating ending Julian day for extracting averages                                  |
| yrstr     | numeric for starting year for trend model, see details  |
| yrend     | numeric for ending year for trend model, see details  |
| yromit    | optional numeric vector for years to omit from the plot, see details                          |
| ylab      | chr string for y-axis label   |
| width     | numeric for width of error bars   |
| size      | numeric for point size  |
| seascol   | chr string for color of the seasonal averages   |
| trndcol   | chr sting for color of the trend line   |
| nsim      | numeric indicating number of random draws for simulating uncertainty                          |
| useave    | logical indicating if anlz_avgseason is used for the seasonal metric calculation, see details |
| base_size | numeric indicating base font size, passed to theme_bw   |
| xlim      | optional numeric vector of length two for x-axis limits                                       |
| ylim      | optional numeric vector of length two for y-axis limits                                       |
|           | additional arguments passed to metfun, e.g., na.rm = TRUE                                     |
|           |   |

## Details

Setting yrstr or yrend to NULL will suppress plotting of the trend line for the meta-analysis regression model.

The optional yromit vector can be used to omit years from the plot and trend assessment. This may be preferred if seasonal estimates for a given year have very wide confidence intervals likely due to limited data, which can skew the trend assessments.

Set useave = T to speed up calculations if metfun = mean. This will use anlz\_avgseason to estimate the seasonal summary metrics using a non-stochastic equation.

#### Value

A ggplot object

```
library(dplyr)
# data to model
tomod <- rawdat %>%
filter(station %in% 34) %>%
filter(param %in% 'chl') %>%
```

```
filter(yr > 2015)
mod <- anlz_gam(tomod, trans = 'ident')
show_metseason(mod, doystr = 90, doyend = 180, yrstr = 2016, yrend = 2019,
    ylab = 'Chlorophyll-a (ug/L)')
# show seasonal metrics without annual trend
show_metseason(mod, doystr = 90, doyend = 180, yrstr = NULL, yrend = NULL,
    ylab = 'Chlorophyll-a (ug/L)')
# omit years from the analysis
show_metseason(mod, doystr = 90, doyend = 180, yrstr = 2016, yrend = 2019,
    yromit = 2017, ylab = 'Chlorophyll-a (ug/L)')</pre>
```

show\_mettrndseason Plot seasonal metrics and rates of change

## Description

Plot seasonal metrics and rates of change

## Usage

```
show_mettrndseason(
 mod,
 metfun = mean,
 doystr = 1,
 doyend = 364,
  justify = c("center", "left", "right"),
 win = 5,
 nsim = 10000,
 useave = FALSE,
 yromit = NULL,
 ylab,
 width = 0.9,
  size = 3,
 nms = NULL,
  fils = NULL,
  cmbn = F,
 base_size = 11,
 xlim = NULL,
 ylim = NULL,
  . . .
)
```

#### Arguments

| mod       | input model object as returned by anlz_gam  |
|-----------|---|
| metfun    | function input for metric to calculate, e.g., mean, var, max, etc                             |
| doystr    | numeric indicating start Julian day for extracting averages                                   |
| doyend    | numeric indicating ending Julian day for extracting averages                                  |
| justify   | chr string indicating the justification for the trend window                                  |
| win       | numeric indicating number of years to use for the trend window, see details                   |
| nsim      | numeric indicating number of random draws for simulating uncertainty                          |
| useave    | logical indicating if anlz_avgseason is used for the seasonal metric calculation, see details |
| yromit    | optional numeric vector for years to omit from the plot, see details                          |
| ylab      | chr string for y-axis label   |
| width     | numeric for width of error bars   |
| size      | numeric for point size  |
| nms       | optional character vector for trend names, see details  |
| fils      | optional character vector for the fill of interior point colors, see details                  |
| cmbn      | logical indicating if the no trend and no estimate colors should be combined, see details     |
| base_size | numeric indicating base font size, passed to theme_bw   |
| xlim      | optional numeric vector of length two for x-axis limits                                       |
| ylim      | optional numeric vector of length two for y-axis limits                                       |
|           | additional arguments passed to metfun, e.g., na.rm = TRUE                                     |
|           |   |

## Details

The plot is the same as that returned by show\_metseason with the addition of points for the seasonal metrics colored by the trends estimated from anlz\_trndseason for the specified window and justification.

Four colors are used to define increasing, decreasing, no trend, or no estimate (i.e., too few points for the window). The names and the colors can be changed using the nms and fils arguments, respectively. The cmbn argument can be used to combine the no trend and no estimate colors into one color and label. Although this may be desired for aesthetic reasons, the colors and labels may be misleading with the default names since no trend is shown for points where no estimates were made.

The optional yromit vector can be used to omit years from the plot and trend assessment. This may be preferred if seasonal estimates for a given year have very wide confidence intervals likely due to limited data, which can skew the trend assessments.

#### Value

A ggplot object

## Examples

library(dplyr)

```
# data to model
tomod <- rawdat %>%
filter(station %in% 34) %>%
filter(param %in% 'chl') %>%
filter(yr > 2015)
mod <- anlz_gam(tomod, trans = 'log10')
show_mettrndseason(mod, metfun = mean, doystr = 90, doyend = 180, justify = 'center',
win = 4, ylab = 'Chlorophyll-a (ug/L)')
```

show\_perchg

```
Plot percent change trends from GAM results for selected time periods
```

## Description

Plot percent change trends from GAM results for selected time periods

#### Usage

```
show_perchg(
  mod,
  baseyr,
  testyr,
  ylab,
  base_size = 11,
  xlim = NULL,
  ylim = NULL
)
```

#### Arguments

| mod       | input model object as returned by anlz_gam              |
|-----------|---|
| baseyr    | numeric vector of starting years                        |
| testyr    | numeric vector of ending years                          |
| ylab      | chr string for y-axis label                             |
| base_size | numeric indicating base font size, passed to theme_bw   |
| xlim      | optional numeric vector of length two for x-axis limits |
| ylim      | optional numeric vector of length two for y-axis limits |

## Value

A ggplot object

22

## show\_prd3d

## Examples

library(dplyr)

```
# data to model
tomod <- rawdat %>%
filter(station %in% 34) %>%
filter(param %in% 'chl')
mod <- anlz_gam(tomod, trans = 'log10')
show_perchg(mod, baseyr = 1995, testyr = 2016, ylab = 'Chlorophyll-a (ug/L)')
```

show\_prd3d Plot a 3-d surface of predictions

## Description

Plot a 3-d surface of predictions

## Usage

show\_prd3d(mod, ylab)

## Arguments

| mod  | input model object as returned by anlz_gam |
|------|--|
| ylab | chr string for y-axis label                |

## Value

a plotly surface

```
library(dplyr)
# data to model
tomod <- rawdat %>%
filter(station %in% 34) %>%
filter(param %in% 'chl') %>%
filter(yr > 2015)
mod <- anlz_gam(tomod, trans = 'log10')
show_prd3d(mod, ylab = 'Chlorophyll-a (ug/L)')</pre>
```

show\_prddoy

## Description

Plot predictions for GAMs against day of year

## Usage

show\_prddoy(mod, ylab, yromit = NULL, size = 0.5, alpha = 1, base\_size = 11)

#### Arguments

| mod       | input model object as returned by anlz_gam                           |
|-----------|--|
| ylab      | chr string for y-axis label  |
| yromit    | optional numeric vector for years to omit from the plot, see details |
| size      | numeric indicating line size   |
| alpha     | numeric from 0 to 1 indicating line transparency                     |
| base_size | numeric indicating base font size, passed to theme_bw                |

## Details

The optional yromit vector can be used to omit years from the plot. This may be preferred if the predicted values from the model deviate substantially from other years likely due to missing data.

#### Value

A ggplot object

```
library(dplyr)
# data to model
tomod <- rawdat %>%
  filter(station %in% 34) %>%
  filter(param %in% 'chl')
mod <- anlz_gam(tomod, trans = 'log10')
show_prddoy(mod, ylab = 'Chlorophyll-a (ug/L)')</pre>
```

show\_prdseason

## Description

Plot predictions for GAMs over time, by season

## Usage

```
show_prdseason(
 mod,
 ylab,
 yromit = NULL,
 base_size = 11,
 xlim = NULL,
 ylim = NULL
)
```

## Arguments

| mod       | input model object as returned by anlz_gam                           |
|-----------|--|
| ylab      | chr string for y-axis label  |
| yromit    | optional numeric vector for years to omit from the plot, see details |
| base_size | numeric indicating base font size, passed to theme_bw                |
| xlim      | optional numeric vector of length two for x-axis limits              |
| ylim      | optional numeric vector of length two for y-axis limits              |

## Value

A ggplot object

```
library(dplyr)
# data to model
tomod <- rawdat %>%
  filter(station %in% 34) %>%
  filter(param %in% 'chl') %>%
  filter(yr > 2015)
mod <- anlz_gam(tomod, trans = 'log10')</pre>
show_prdseason(mod, ylab = 'Chlorophyll-a (ug/L)')
```

show\_prdseries

## Description

Plot predictions for GAMs over time series

## Usage

```
show_prdseries(
  mod,
  ylab,
  yromit = NULL,
  alpha = 0.7,
  base_size = 11,
  xlim = NULL,
  ylim = NULL,
  col = "brown"
)
```

## Arguments

| mod       | input model object as returned by anlz_gam                           |
|-----------|--|
| ylab      | chr string for y-axis label  |
| yromit    | optional numeric vector for years to omit from the plot, see details |
| alpha     | numeric from 0 to 1 indicating line transparency                     |
| base_size | numeric indicating base font size, passed to theme_bw                |
| xlim      | optional numeric vector of length two for x-axis limits              |
| ylim      | optional numeric vector of length two for y-axis limits              |
| col       | optional chr string for line color                                   |

## Details

The optional yromit vector can be used to omit years from the plot. This may be preferred if the predicted values from the model deviate substantially from other years likely due to missing data.

## Value

A ggplot object

show\_sumtrndseason

library(dplyr)

#### Examples

```
# data to model
tomod <- rawdat %>%
filter(station %in% 34) %>%
filter(param %in% 'chl')
mod <- anlz_gam(tomod, trans = 'log10')
show_prdseries(mod, ylab = 'Chlorophyll-a (ug/L)')
```

show\_sumtrndseason Plot seasonal rates of change based on average estimates for multiple window widths

## Description

Plot seasonal rates of change based on average estimates for multiple window widths

## Usage

```
show_sumtrndseason(
    mod,
    doystr = 1,
    doyend = 364,
    yromit = NULL,
    justify = c("center", "left", "right"),
    win = 5:15,
    txtsz = 6,
    cols = c("lightblue", "lightgreen"),
    base_size = 11
)
```

#### Arguments

| mod       | input model object as returned by anlz_gam                            |
|-----------|---|
| doystr    | numeric indicating start Julian day for extracting averages           |
| doyend    | numeric indicating ending Julian day for extracting averages          |
| yromit    | optional numeric vector for years to omit from the plot, see details  |
| justify   | chr string indicating the justification for the trend window          |
| win       | numeric vector indicating number of years to use for the trend window |
| txtsz     | numeric for size of text labels inside the plot                       |
| cols      | vector of low/high colors for trends                                  |
| base_size | numeric indicating base font size, passed to theme_bw                 |
|           |   |

#### Details

This function plots output from anlz\_sumtrndseason.

The optional yromit vector can be used to omit years from the plot and trend assessment. This may be preferred if seasonal estimates for a given year have very wide confidence intervals likely due to limited data, which can skew the trend assessments.

## Value

A ggplot2 plot

## See Also

Other show: show\_sumtrndseason2()

## Examples

```
library(dplyr)
```

```
# data to model
tomod <- rawdat %>%
filter(station %in% 34) %>%
filter(param %in% 'chl') %>%
filter(yr > 2015)
mod <- anlz_gam(tomod, trans = 'log10')
show_sumtrndseason(mod, doystr = 90, doyend = 180, justify = 'center', win = 2:3)
```

show\_sumtrndseason2 Plot seasonal rates of change in quarters based on average estimates for multiple window widths

### Description

Plot seasonal rates of change in quarters based on average estimates for multiple window widths

#### Usage

```
show_sumtrndseason2(
   mod,
   yromit = NULL,
   justify = c("center", "left", "right"),
   win = 5:15,
   txtsz = 6,
   cols = c("lightblue", "lightgreen"),
   base_size = 11
)
```

#### Arguments

| mod       | input model object as returned by anlz_gam                            |
|-----------|---|
| yromit    | optional numeric vector for years to omit from the plot, see details  |
| justify   | chr string indicating the justification for the trend window          |
| win       | numeric vector indicating number of years to use for the trend window |
| txtsz     | numeric for size of text labels inside the plot                       |
| cols      | vector of low/high colors for trends                                  |
| base_size | numeric indicating base font size, passed to theme_bw                 |

## Details

This function is similar to show\_sumtrndseason but results are grouped into seasonal quarters as four separate plots with a combined color scale.

The optional yromit vector can be used to omit years from the plot and trend assessment. This may be preferred if seasonal estimates for a given year have very wide confidence intervals likely due to limited data, which can skew the trend assessments.

## Value

A ggplot2 plot

## See Also

Other show: show\_sumtrndseason()

```
library(dplyr)
```

```
# data to model
tomod <- rawdat %>%
  filter(station %in% 34) %>%
  filter(param %in% 'chl') %>%
  filter(yr > 2015)
mod <- anlz_gam(tomod, trans = 'log10')
show_sumtrndseason2(mod, justify = 'center', win = 2:3)
```

show\_trndseason

## Description

Plot rates of change based on seasonal metrics

## Usage

```
show_trndseason(
 mod,
 metfun = mean,
 doystr = 1,
 doyend = 364,
  type = c("log10", "approx"),
  justify = c("left", "right", "center"),
 win = 5,
 ylab,
 nsim = 10000,
 yromit = NULL,
 useave = FALSE,
 base_size = 11,
 nms = NULL,
 fils = NULL,
 cols = NULL,
 xlim = NULL,
 ylim = NULL,
  . . .
)
```

## Arguments

| mod     | input model object as returned by anlz_gam  |
|---------|---|
| metfun  | function input for metric to calculate, e.g., mean, var, max, etc                             |
| doystr  | numeric indicating start Julian day for extracting averages                                   |
| doyend  | numeric indicating ending Julian day for extracting averages                                  |
| type    | chr string indicating if log slopes are shown (if applicable)                                 |
| justify | chr string indicating the justification for the trend window                                  |
| win     | numeric indicating number of years to use for the trend window, see details                   |
| ylab    | chr string for y-axis label   |
| nsim    | numeric indicating number of random draws for simulating uncertainty                          |
| yromit  | optional numeric vector for years to omit from the output                                     |
| useave  | logical indicating if anlz_avgseason is used for the seasonal metric calculation, see details |

| base_size | numeric indicating base font size, passed to theme_bw           |
|-----------|---|
| nms       | optional character vector for trend names                       |
| fils      | optional character vector for the fill of interior point colors |
| cols      | optional character vector for confidence interval colors        |
| xlim      | optional numeric vector of length two for x-axis limits         |
| ylim      | optional numeric vector of length two for y-axis limits         |
|           | additional arguments passed to metfun, e.g., na.rm = TRUE       |
|           |   |

## Value

A ggplot object

# Index

```
* analyze
    anlz_avgseason, 2
    anlz_backtrans, 3
    anlz_fit,4
    anlz_gam, 5
    anlz_metseason, 6
    anlz_mixmeta, 7
    anlz_perchg, 8
    anlz_prd, 9
    anlz_prdday, 9
    anlz_prdmatrix, 10
    anlz_pvalformat, 11
    anlz_smooth, 11
    anlz_sumstats, 12
    anlz_sumtrndseason, 14
    anlz_trans, 15
    anlz_trndseason, 16
* datasets
    rawdat, 17
* show
    show_metseason, 18
    show_mettrndseason, 20
    show_perchg, 22
    show_prd3d, 23
    show_prddoy, 24
    show_prdseason, 25
    show_prdseries, 26
    show_sumtrndseason, 27
    show_sumtrndseason2, 28
    show_trndseason, 30
* utilities
    rawdat, 17
anlz_avgseason, 2, 13, 16, 19
anlz_backtrans, 3
anlz_fit,4
anlz_gam, 2, 4, 5, 6, 8-10, 12-14, 16, 19,
        21–27, 29, 30
anlz_metseason, 6, 7, 10, 13, 16
anlz_mixmeta, 7, 16
```

anlz\_perchg, 8 anlz\_prd, 3, 9 anlz\_prdday, 9 anlz\_prdmatrix, 10 anlz\_pvalformat, 11 anlz\_smooth, 11 anlz\_sumstats, 12 anlz\_sumtrndseason, 14, 15, 17, 28 anlz\_trans, 3, 5, 15, 15, 17 anlz\_trndseason, 14, 15, 16, 21 gam, 5 ggplot, 19, 21, 22, 24-26, 31 ggplot2, 28, 29 mixmeta, 7, 13 rawdat, 17 s, 5 show\_metseason, 18, 21 show\_mettrndseason, 20 show\_perchg, 22 show\_prd3d, 23 show\_prddoy, 24 show\_prdseason, 25 show\_prdseries, 26 show\_sumtrndseason, 27, 29 show\_sumtrndseason2, 28, 28

theme\_bw, 19, 21, 22, 24-27, 29, 31

show\_trndseason, 30