Package 'stdmod'

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Title Standardized Moderation Effect and Its Confidence Interval

Version 0.1.7.4

Description Functions for computing a standardized moderation effect in moderated regression and forming its confidence interval by nonparametric bootstrapping as proposed in Cheung, Cheung, Lau, Hui, and Vong (2022) <doi:10.1037/hea0001188>. Also includes simple-to-use functions for computing conditional effects (unstandardized or standardized) and plotting moderation effects.

URL https://sfcheung.github.io/stdmod/

BugReports https://github.com/sfcheung/stdmod/issues

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2 add1.std_selected

R topics documented:

	3
vcov.std_selected	34
update.std_selected	33
• =	
<u> </u>	
_	
<u>.</u>	
-	
add1.std_selected	
	coef.stdmod_lavaan cond_effect confint.stdmod_lavaan confint.std_selected plotmod print.cond_effect print.stdmod_lavaan print.std_selected print.summary.std_selected print.summary.std_selected sleep_emo_con stdmod stdmod_lavaan std_selected summary.std_selected test_mod1 test_mod2 test_mod2 test_mod3_miss test_x_1_w_1_v_1_cat1_n_500 test_x_1_w_1_v_1_cat1_xw_cov_n_500 test_x_1_w_1_v_1_cat1_xw_cov_wcat3_n_500 test_x_1_w_1_v_2_n_500 update.std_selected

add1.std_selected

The 'add1' Method for a 'std_selected' Class Object

Description

Intercept the add1() method and raise an error.

Usage

```
## S3 method for class 'std_selected'
add1(object, ...)
```

Arguments

```
object The output of std_selected() or std_selected_boot().
... Additional arguments. They will be ignored.
```

Details

add1() should not be used after the output of lm() is processed by std_selected() or std_selected_boot().

coef.stdmod_lavaan 3

Value

It returns nothing. It is called for its side effect.

Author(s)

```
Shu Fai Cheung https://orcid.org/0000-0002-9871-9448
```

coef.stdmod_lavaan

Standardized Moderation Effect in a 'stdmod_lavaan' Class Object

Description

Return the estimate of the standardized moderation effect in the output of stdmod_lavaan().

Usage

```
## S3 method for class 'stdmod_lavaan'
coef(object, ...)
```

Arguments

object The output of stdmod_lavaan().
... Optional arguments. Ignored by the function.

Details

It just extracts and returns the element stdmod.

Value

A scalar: The estimate of the standardized moderation effect.

Author(s)

```
Shu Fai Cheung https://orcid.org/0000-0002-9871-9448
```

```
# Load a test data of 500 cases
dat <- test_mod1
library(lavaan)

mod <-
"
med ~ iv + mod + iv:mod + cov1
dv ~ med + cov2
"</pre>
```

```
fit <- sem(mod, dat)</pre>
coef(fit)
# Compute the standardized moderation effect
out_noboot <- stdmod_lavaan(fit = fit,</pre>
                             x = "iv",
                             y = "med",
                             w = "mod",
                             x_w = "iv:mod")
coef(out_noboot)
# Compute the standardized moderation effect and
# its confidence interval based on nonparametric bootstrapping
set.seed(8479075)
system.time(out_boot <- stdmod_lavaan(fit = fit,</pre>
                                        x = "iv",
                                        y = "med"
                                        w = "mod",
                                        x_w = "iv:mod",
                                        boot_ci = TRUE,
                                        R = 50)
# In real analysis, R should be at least 2000.
coef(out_boot)
```

cond_effect

Conditional Effects

Description

Compute the conditional effects in a moderated regression model.

Usage

```
cond_effect(
  output,
  x = NULL,
  w = NULL,
  w_method = c("sd", "percentile"),
  w_percentiles = c(0.16, 0.5, 0.84),
  w_sd_to_percentiles = NA,
  w_from_mean_in_sd = 1
)

cond_effect_boot(
  output,
  x = NULL,
  w = NULL,
  ...,
```

```
conf = 0.95,
nboot = 100,
boot_args = NULL,
save_boot_est = TRUE,
full_output = FALSE
)
```

Arguments

output The output from stats::lm(). It can also accept the output from $std_selected()$

or std_selected_boot().

x The focal variable (independent variable), that is, the variable with its effect

on the outcome variable (dependent) being moderated. It must be a numeric

variable.

W The moderator. Both numeric variables and categorical variables (character or

factor) are supported.

w_method How to define "low", "medium", and "high" for the moderator levels. Default

is in terms of mean and standard deviation (SD) of the moderator, "sd": "low", "medium", and "high" are one SD below mean, mean, and one SD above mean, respectively. If equal to "percentile", then percentiles of the moderator in the dataset are used: "low", "medium", and "high" are 16th, 50th (median), and 84th

percentiles, respectively. Ignored if w is categorical.

to be used, divided by 100. It must be a vector of two numbers. The default is c(.16, .50, .84), the 16th, 50th, and 84th percentiles, which corresponds approximately to one SD below and above mean in a normal distribution, re-

spectively. Ignored if w is categorical.

w_sd_to_percentiles

If w_method is "percentile" and this argument is set to a number, this number will be used to to determine the percentiles to be used. The lower percentile is the percentile in a normal distribution that is w_sd_to_percentiles SD below the mean. The upper percentile is the percentile in a normal distribution that is w_sd_to_percentiles SD above the mean. Therefore, if w_sd_to_percentiles is set to 1, then the lower and upper percentiles are 16th and 84th, respectively.

Default is NA.

w_from_mean_in_sd

How many SD from mean is used to define "low" and "high" for the moderator.

Default is 1. Ignored if w is categorical.

... Arguments to be passed to cond_effect().

conf The level of confidence for the confidence interval. Default is .95, to get 95%

confidence intervals.

nboot The number of bootstrap samples. Default is 100.

boot_args A named list of arguments to be passed to boot::boot(). Default is NULL.

of the output.

full_output

Whether the full output from boot::boot() will be returned. Default is FALSE. If TRUE, the full output from boot::boot() will be saved in the element boot_out of the output.

Details

cond_effect() uses the centering approach to find the conditional effect of the focal variable. For each level of the moderator, the value for this level is subtracted from the moderator scores, and the model is fitted to the modified data. The coefficient of the focal variable is then the conditional effect of the focal variable when the moderator's score is equal this value.

cond_effect_boot() function is a wrapper of cond_effect(). It calls cond_effect() once for each bootstrap sample, and then computes the nonparametric bootstrap percentile confidence intervals (Cheung, Cheung, Lau, Hui, & Vong, 2022). If the output object is the output of std_selected() or std_selected_boot(), in which mean-centering and/or standardization have been conducted, they will be repeated in each bootstrap sample. Therefore, like std_selected_boot(), it can be used for form nonparametric bootstrap confidence intervals for standardized effects, though cond_effect_boot() does this for the standardized conditional effects.

This function intentionally does not have an argument for setting the seed for random number. Users are recommended to set the seed, e.g., using set.seed() before calling it, to ensure reproducibility.

Value

cond_effect() returns a data-frame-like object of the conditional effects. The class is cond_effect and the print method will print additional information of the conditional effects. Additional information is stored in the following attributes:

- call: The original call.
- output: The output object, such as the output from lm().
- x, y, and w: The three variables used to compute the conditional effects: focal variable (x), outcome variable (y), and the moderator (w).
- w_method: The method used to determine the values of the moderator at the selected levels.
- w_percentiles The percentiles to use if w_method = "percentile".
- w_sd_to_percentiles: If not equal to NA, this is a scalar, the number of standard deviation from the mean used to determine the percentiles for the "low" and "high" levels of the moderator.
- w_from_mean_in_sd: The number of SD above or below the mean, for determining the "low" and "high" levels of the moderator if w_method is "sd".
- w_empirical_percentiles: The actual percentile levels in the dataset for the selected levels
 of the moderator. A numeric vector.
- w_empirical_z: The actual distance from the mean, in SD, of each selected level of the moderator. A numeric vector.
- y_standardized, x_standardized, and w_standardized: Each of them is a logical scalar, indicating whether the outcome variable, focal variable, and moderator are standardized.

cond_effect_boot() also returns a data-frame-like object of the conditional effects of the class cond_effect, with additional information from the bootstrapping stored in these attributes:

- boot_ci: A data frame of the bootstrap confidence intervals of the conditional effects.
- nboot: The number of bootstrap samples requested.
- conf: The level of confidence, in proportion.
- boot_est: A matrix of the bootstrap estimates of the conditional effects. The number of rows equal to nboot, and the number of columns equal to the number of levels of the moderator.
- cond_effect_boot_call: The call to cond_effect_boot().
- boot_out: If available, the original output from boot::boot().

Functions

cond_effect_boot: A wrapper of cond_effect() that forms nonparametric bootstrap confidence intervals.

Author(s)

```
Shu Fai Cheung https://orcid.org/0000-0002-9871-9448
```

```
# Load a sample data set
dat <- test_x_1_w_1_v_1_cat1_n_500
# Do a moderated regression by lm
lm_raw <- lm(dv \sim iv*mod + v1 + cat1, dat)
summary(lm_raw)
cond_effect(lm_raw, x = iv, w = mod)
lm_std <- std_selected(lm_raw, to_scale = ~ iv + mod, to_center = ~ iv + mod)</pre>
cond_effect(lm_std, x = iv, w = mod)
# Categorical moderator
lm_cat <- lm(dv \sim iv*cat1 + v1, dat)
summary(lm_cat)
cond_effect(lm_cat, x = iv, w = cat1)
# Load a sample data set
dat <- test_x_1_w_1_v_1_cat1_n_500
# Do a moderated regression by lm
lm_raw <- lm(dv \sim iv*mod + v1 + cat1, dat)
summary(lm_raw)
lm_std <- std_selected(lm_raw, to_scale = ~ iv + mod, to_center = ~ iv + mod)</pre>
cond_effect(lm_std, x = iv, w = mod)
# Form nonparametric bootstrap confidence intervals
```

confint.stdmod_lavaan

```
out <- cond_effect_boot(lm_std, x = iv, w = mod, nboot = 50) out
```

confint.stdmod_lavaan Confidence Intervals for a 'stdmod_lavaan' Class Object

Description

Return the confidence interval of the standardized moderation effect in the output of stdmod_lavaan().

Usage

```
## S3 method for class 'stdmod_lavaan'
confint(object, parm, level = 0.95, ...)
```

Arguments

object The output of stdmod_lavaan().

parm Ignored. Always return the bootstrap confidence interval of the standardized moderation effect.

level The level of confidence, default is .95, returning the 95% confidence interval.

Additional arguments. Ignored by the function.

Details

If bootstrapping is used to form the confidence interval by stdmod_lavaan(), users can request the percentile confidence interval of using the stored bootstrap estimate.

Value

A one-row matrix of the confidence intervals.

Author(s)

```
Shu Fai Cheung https://orcid.org/0000-0002-9871-9448
```

```
# Load a test data of 500 cases
dat <- test_mod1
library(lavaan)

mod <-
"
med ~ iv + mod + iv:mod + cov1
dv ~ med + cov2</pre>
```

confint.std_selected 9

confint.std_selected Confidence Intervals for a 'std_selected' Class Object

Description

Return the confidence intervals of estimates in the output of std_selected() or std_selected_boot().

Usage

```
## S3 method for class 'std_selected'
confint(object, parm, level = 0.95, type = "lm", ...)
```

Arguments

object	The output of std_selected() or std_selected_boot().
parm	The parameters (coefficients) for which confidence intervals should be returned. If missing, the confidence intervals of all parameters will be returned.
level	The level of confidence. For the confidence intervals returned by $lm()$, default is .95, i.e., 95%. For the bootstrap percentile confidence intervals, default is the level used in calling $std_selected_boot()$. If a level different from that in the original call is specified, $full_output$ needs to be set in the call to $std_selected_boot()$ such that the original bootstrapping output is stored.
type	The type of the confidence intervals. Default is " lm ", returned by the confint() method of lm (). If set to "boot", the bootstrap percentile confidence intervals are returned.
	Arguments to be passed to summary.lm().

10 confint.std_selected

Details

If bootstrapping is used to form the confidence interval by std_selected_boot(), users can request the percentile confidence intervals of the bootstrap estimates. This method does not do the bootstrapping itself.

Value

A matrix of the confidence intervals.

Author(s)

```
Shu Fai Cheung https://orcid.org/0000-0002-9871-9448
```

```
# Load a sample data set
dat <- test_x_1_w_1_v_1_cat1_n_500
\# Do a moderated regression by lm
lm_raw \leftarrow lm(dv \sim iv*mod + v1 + cat1, dat)
summary(lm_raw)
# Standardize all variables except for categorical variables.
# Interaction terms are formed after standardization.
lm_std <- std_selected(lm_raw, to_scale = ~ .,</pre>
                                to_center = ~ .)
summary(lm_std)
confint(lm_std)
# With bootstrapping
\# nboot = 100 just for illustration. nboot >= 2000 should be used in read
# research.
lm_std_boot <- std_selected_boot(lm_raw, to_scale = ~ .,</pre>
                                           to_center = ~ .,
                                           nboot = 100)
summary(lm_std_boot)
confint(lm_std_boot)
# Bootstrap percentile intervals
confint(lm_std_boot, type = "boot")
```

plotmod 11

plotmod

Moderation Effect Plot

Description

Plot the moderation effect in a regression model

Usage

```
plotmod(
 output,
  х,
 W,
  x_{label},
 w_label,
 y_label,
  title,
 digits = 3,
 x_from_mean_in_sd = 1,
 w_from_mean_in_sd = 1,
 w_method = c("sd", "percentile"),
 w_percentiles = c(0.16, 0.84),
 x_method = c("sd", "percentile"),
  x_percentiles = c(0.16, 0.84),
 w_sd_to_percentiles = NA,
  x_sd_to_percentiles = NA,
  note_standardized = TRUE,
  no_title = FALSE,
  line_width = 1,
 point_size = 5,
  graph_type = c("default", "tumble")
)
```

Arguments

output	The output of stats::lm(), std_selected(), or std_selected_boot().
x	The name of the focal variable (x-axis) in 'output". It can be the name of the variable, with or without quotes. Currently only numeric variables are supported.
W	The name of the moderator in output. It can be the name of the variable, with or without quotes.
x_label	The label for the X-axis. Default is the value of x.
w_label	The label for the legend for the lines. Default is the value ofw.
y_label	The label for the Y-axis. Default is the name of the response variable in the model.

12 plotmod

title

The title of the graph. If not supplied, it will be generated from the variable names or labels (in x_label, y_label, and w_label). If "", no title will be printed. This can be used when the plot is for manuscript submission and figures are required to have no titles.

digits

Number of decimal places to print. Default is 3.

x_from_mean_in_sd

How many SD from mean is used to define "low" and "high" for the focal variable. Default is 1.

w_from_mean_in_sd

How many SD from mean is used to define "low" and "high" for the moderator. Default is 1. Ignored if w is categorical.

w method

How to define "high" and "low" for the moderator levels. Default is in terms of the standard deviation of the moderator, "sd". If equal to "percentile", then the percentiles of the moderator in the dataset are used. Ignored if w is categorical.

w_percentiles

If w_method is "percentile", then this argument specifies the two percentiles to be used, divided by 100. It must be a vector of two numbers. The default is c(.16, .84), the 16th and 84th percentiles, which corresponds approximately to one SD below and above mean for a normal distribution, respectively. Ignored if w is categorical.

x_method

How to define "high" and "low" for the focal variable levels. Default is in terms of the standard deviation of the focal variable, "sd". If equal to "percentile", then the percentiles of the focal variable in the dataset is used.

x_percentiles

If x_method is "percentile", then this argument specifies the two percentiles to be used, divided by 100. It must be a vector of two numbers. The default is c(.16, .84), the 16th and 84th percentiles, which corresponds approximately to one SD below and above mean for a normal distribution, respectively.

w_sd_to_percentiles

If w_method is "percentile" and this argument is set to a number, this number will be used to determine the percentiles to be used. The lower percentile is the percentile in a normal distribution that is w_sd_to_percentiles SD below the mean. The upper percentile is the percentile in a normal distribution that is w_sd_to_percentiles SD above the mean. Therefore, if w_sd_to_percentiles is set to 1, then the lower and upper percentiles are 16th and 84th, respectively. Default is NA.

x_sd_to_percentiles

If x_method is "percentile" and this argument is set to a number, this number will be used to determine the percentiles to be used. The lower percentile is the percentile in a normal distribution that is $x_sd_{to_percentiles}$ SD below the mean. The upper percentile is the percentile in a normal distribution that is $x_sd_{to_percentiles}$ SD above the mean. Therefore, if $x_sd_{to_percentiles}$ is set to 1, then the lower and upper percentiles are 16th and 84th, respectively. Default is NA.

note_standardized

If TRUE, will check whether a variable has SD nearly equal to one. If yes, will report this in the plot. Default is TRUE.

plotmod 13

no_title	If TRUE, title will be suppressed. Default is FALSE.
line_width	The width of the lines as used in ggplot2::geom_segment(). Default is 1.
point_size	The size of the points as used in ggplot2::geom_point(). Default is 5.
graph_type	If "default", the typical line-graph with equal end-points will be plotted. If "tubmle", then the tumble graph proposed by Bodner (2016) will be plotted. Default is "default".

Details

This function generate a basic ggplot2 graph typically found in psychology manuscripts. It tries to check whether one or more variables are standardized, and report this in the plot if required.

This function only has features for typical plots of moderation effects. It is not intended to be a flexible tool for a fine control on the plots.

Value

A ggplot2 graph. Plotted if not assigned to a name. It can be further modified like a usual ggplot2 graph.

Author(s)

```
Shu Fai Cheung https://orcid.org/0000-0002-9871-9448
```

References

Bodner, T. E. (2016). Tumble graphs: Avoiding misleading end point extrapolation when graphing interactions from a moderated multiple regression analysis. *Journal of Educational and Behavioral Statistics*, 41(6), 593-604. doi:10.3102/1076998616657080

```
# Do a moderated regression by lm
lm_out <- lm(sleep_duration ~ age + gender + emotional_stability*conscientiousness, sleep_emo_con)</pre>
plotmod(lm_out,
        x = emotional_stability,
        w = conscientiousness,
        x_label = "Emotional Stability",
        w_label = "Conscientiousness",
        y_label = "Sleep Duration")
# Standardize all variables except for categorical variables
lm_std <- std_selected(lm_out,</pre>
                       to_scale = \sim .,
                        to_center = ~ .)
plotmod(lm_std,
        x = emotional_stability,
        w = conscientiousness,
        x_label = "Emotional Stability",
        w_label = "Conscientiousness",
```

14 print.cond_effect

print.cond_effect

Print a 'cond_effect' Class Object

Description

Print the output of cond_effect() or cond_effect_boot().

Usage

```
## S3 method for class 'cond_effect'
print(
    x,
    nd = 3,
    nd_stat = 3,
    nd_p = 3,
    title = TRUE,
    model = TRUE,
    level_info = TRUE,
    standardized = TRUE,
    boot_info = TRUE,
    table_only = FALSE,
    ...
)
```

Arguments

The output of cond_effect() or cond_effect_boot().

The number of digits for the variables.

The number of digits for test statistics (e.g., t).

The number of digits for p-values.

The number of digits for p-values.

The number of digits for p-values.

If TRUE, print a title. Default is TRUE.

The number of digits for p-values.

The number of digits for p-values.

The number of digits for p-values.

The number of digits for test statistics (e.g., t).

level_info If TRUE, print information for interpreting the levels of the moderator, such as the values of the levels and distance from the mean. Default is TRUE.

print.stdmod_lavaan 15

standardized	If TRUE and one or more variables are standardized, report it. Default is TRUE.
boot_info	If TRUE and bootstrap estimates are in x , print information about the bootstrapping, such as the number of bootstrap samples. Default is TRUE.
table_only	If TRUE, will suppress of other elements except for the table of conditional effects. Override arguments such as title, model, and level_info.
	Additional arguments. Ignored by this function.

Value

x is returned invisibility.

Author(s)

```
Shu Fai Cheung https://orcid.org/0000-0002-9871-9448
```

Examples

Description

Print the output of stdmod_lavaan().

Usage

```
## S3 method for class 'stdmod_lavaan'
print(x, conf = 0.95, nd = 3, ...)
```

print.stdmod_lavaan

Arguments

The output of stdmod_lavaan().

Conf If nonparametric bootstrapping has been conducted by stdmod_lavaan(), this is the level of confidence in proportion (.95 denotes 95%), of the confidence interval. Default is .95.

Ind The number of digits to be printed.

Optional arguments. Ignored.

Value

x is returned invisibly.

Author(s)

Shu Fai Cheung https://orcid.org/0000-0002-9871-9448

```
# Load a test data of 500 cases
dat <- test_mod1
library(lavaan)
mod <-
med ~ iv + mod + iv:mod + cov1
dv \sim med + cov2
fit <- sem(mod, dat)</pre>
coef(fit)
# Compute the standardized moderation effect
out_noboot <- stdmod_lavaan(fit = fit,</pre>
                             x = "iv",
                             y = "med",
                             w = "mod",
                             x_w = "iv:mod"
out_noboot
# Compute the standardized moderation effect and
# its percentile confidence interval based on nonparametric bootstrapping
set.seed(8479075)
system.time(out_boot <- stdmod_lavaan(fit = fit,</pre>
                                        y = "med",
                                        w = "mod",
                                        x_w = "iv:mod",
                                        boot_ci = TRUE,
                                        R = 50))
```

print.std_selected 17

```
# In real analysis, R should be at least 2000.
out_boot
```

print.std_selected

Print Basic Information of a 'std_selected' Class Object

Description

Provide information of centering and scaling, along with basic model information printed by print.lm().

Usage

```
## S3 method for class 'std_selected'
print(x, ...)
```

Arguments

```
x The output of std_selected() or std_selected_boot().... Arguments to be passed to print.lm().
```

Value

x is returned invisibly.

Author(s)

```
Shu Fai Cheung https://orcid.org/0000-0002-9871-9448
```

```
print.summary.std_selected
```

Print the Summary of a 'std_selected' Class Object

Description

Print the summary generated by summary() on the output of std_selected() or std_selected_boot().

Usage

```
## S3 method for class 'summary.std_selected' print(x, ...)
```

Arguments

- The output of summary().
- ... Arguments to be passed to summary().

Value

x is returned invisibly.

Author(s)

```
Shu Fai Cheung https://orcid.org/0000-0002-9871-9448
```

sleep_emo_con 19

sleep_emo_con

Sample Dataset: Predicting Sleep Duration

Description

A random subset from a real dataset. For illustration.

Usage

```
sleep_emo_con
```

Format

A data frame with 500 rows and six variables:

```
case_id Case ID, integer
sleep_duration Sleep duration in hours
conscientiousness Conscientiousness score, continuous
emotional_stability Emotional stability score, continuous
age Age in years
gender Gender, string, "female" or "male"
```

 ${\tt stdmod}$

Standardized Moderation Effect Given an 'lm' Output

Description

Compute the standardized moderation effect in a moderated regression model.

20 stdmod

Usage

```
stdmod(
  lm_out,
 x = NULL
 w = NULL,
 y = NULL,
 x_rescale = TRUE,
 w_rescale = TRUE,
 y_rescale = TRUE
)
stdmod_boot(
  lm_out,
  ...,
  nboot = 100,
  conf = 0.95,
  boot_args = NULL,
  full_output = FALSE
)
```

Arguments

lm_out	The output from $lm()$.
х	The focal variable, that is, the variable with its effect being moderated. If supplied, its standard deviation will be used for rescaling. Also called the independent variable in some models. Default is NULL.
W	The moderator. If supplied, its standard deviation will be used for rescaling. Default is NULL.
У	The outcome variable (dependent variable) . If supplied, its standard deviation will be used for rescaling. Default is NULL.
x_rescale	If TRUE, will rescale x by its standard deviation. Default is TRUE.
w_rescale	If TRUE, will rescale w by its standard deviation. Default is TRUE.
y_rescale	If TRUE, will rescale y by its standard deviation. Default is TRUE.
	Parameters to be passed to stdmod().
nboot	The number of bootstrap samples. Default is 100.
conf	The level of confidence for the confidence interval. Default is .95.
boot_args	A named list of arguments to be passed to boot::boot(). Default is NULL.
full_output	Whether the full output from boot::boot() is returned. Default is FALSE.

Details

Two more general functions, std_selected() and std_selected_boot(), have been developed and can do what these functions do and more. Users are recommended to use them instead of stdmod() and stdmod_boot(). These two functions will not be updated in the near future.

stdmod 21

Nevertheless, if computing the standardized moderation effect and forming its nonparametric bootstrap interval are all required, then these functions can still be used.

stdmod() computes the standardized moderation effect given an lm() output using the formula from Cheung, Cheung, Lau, Hui, and Vong (2022). Users specify the moderator, the focal variable (the variable with its effect on the outcome variable moderated), the outcome variable (dependent variable), and the corresponding standardized moderation effect. Users can also select which variable(s) will be standardized.

stdmod_boot() is a wrapper of stdmod(). It computes the nonparametric bootstrap confidence interval of the standardized moderation effect, as suggested by Cheung, Cheung, Lau, Hui, and Vong (2022), given the output of lm()

Percentile interval from boot::boot.ci() is returned by this function. If other types of confidence intervals are desired, set full_output = TRUE and use boot::boot.ci() on the element boot_out in the output of this function.

Value

stdmod() returns a scalar: The standardized moderation effect.

stdmod_boot() returns a list with two elements. The element ci is a numeric vector of the bootstrap confidence interval. The element boot_out, if not NA, is the output of boot::boot(), which is used to do the bootstrapping.

Functions

- stdmod: The base function for computing standardized moderation effect
- stdmod_boot: A wrapper of stdmod() that computes the nonparametric bootstrap confidence interval of the standardized moderation effect.

Author(s)

```
Shu Fai Cheung https://orcid.org/0000-0002-9871-9448
```

References

Cheung, S. F., Cheung, S.-H., Lau, E. Y. Y., Hui, C. H., & Vong, W. N. (2022) Improving an old way to measure moderation effect in standardized units. Advance online publication. *Health Psychology*. doi:10.1037/hea0001188

```
# Load a test data of 500 cases

dat <- test_x_1_w_1_v_2_n_500

# Do regression as usual:
lm_raw <- lm(dv ~ iv*mod + v1 + v2, dat)
summary(lm_raw)

# The standard deviations of iv, dv, and mod:</pre>
```

22 stdmod_lavaan

```
sds <- apply(dat, 2, sd)
# Compute the standardized moderation effect:
stdmod_xyw \leftarrow stdmod(lm_raw, x = iv, y = dv, w = mod)
stdmod_xyw
# By default, all three variables will be standardized.
# Check against self-computed standardized moderation effect:
coef(lm_raw)["iv:mod"] * sds["iv"] * sds["mod"] / sds["dv"]
# Standardize only the iv, i.e., do not standardized dv and the moderator:
stdmod_x \leftarrow stdmod(lm_raw, x = iv, y = dv, w = mod,
                   x_rescale = TRUE, y_rescale = FALSE, w_rescale = FALSE)
stdmod_x
# Check against self-computed moderation effect with only iv standardized:
coef(lm_raw)["iv:mod"] * sds["iv"]
dat <- test_x_1_w_1_v_2_n_500
# Do regression as usual:
lm_raw \leftarrow lm(dv \sim iv*mod + v1 + v2, dat)
# Compute the standardized moderation effect.
# Form its confidence interval by nonparametric bootstrapping.
set.seed(85740917)
stdmod_xyw_boot <- stdmod_boot(lm_raw, x = iv, w = mod, y = dv, nboot = 100)
# In real analysis, nboot should be at least 2000.
# Print the ci
stdmod_xyw_boot$ci
# Repeat the analysis but keep the results from boot:
set.seed(85740917)
stdmod_xyw_boot <- stdmod_boot(lm_raw, x = iv, w = mod, y = dv,</pre>
                                  nboot = 200, full_output = TRUE)
# In real analysis, nboot should be at least 2000.
# Print the 95% percentile confidence interval
stdmod_xyw_boot$ci
```

stdmod_lavaan

Standardized Moderation Effect and Its Bootstrap CI in 'lavaan'

Description

Compute the standardized moderation effect in a structural equation model fitted by lavaan::lavaan() or its wrappers and form the nonparametric bootstrap confidence interval.

stdmod_lavaan 23

Usage

```
stdmod_lavaan(fit, x, y, w, x_w, boot_ci = FALSE, R = 100, conf = 0.95, ...)
```

Arguments

fit	The SEM output by lavaan::lavaan() or its wrappers.
x	The name of the focal variable in the model, the variable with its effect on the outcome variable being moderated.
у	The name of the outcome variable (dependent variable) in the model.
W	The name of the moderator in the model.
X_W	The name of the product term $(x * w)$ in the model. It can be the variable generated by the colon operator, e.g., "x:w", which is only in the model and not in the original data set.
boot_ci	Boolean. Whether nonparametric bootstrapping will be conducted. Default is FALSE.
R	The number of nonparametric bootstrapping samples. Default is 100. Set this to at least 2000 in actual use.
conf	The level of confidence. Default is .95, i.e., 95%.
•••	Optional arguments to be passed to boot::boot(). Parallel processing can be used by adding the appropriate arguments in boot::boot().

Details

stdmod_lavaan() accepts a lavaan::lavaan object, the structural equation model output returned by lavaan::lavaan() and its wrappers (e.g, lavaan::sem()) and computes the standardized moderation effect using the formula in the appendix of Cheung, Cheung, Lau, Hui, and Vong (2022).

The standard deviations of the focal variable (the variable with its effect on the outcome variable being moderated), moderator, and outcome variable (dependent variable) are computed from the implied covariance matrix returned by lavaan::lavInspect(). Therefore, models fitted to data sets with missing data (e.g., with missing = "fiml") are also supported.

If nonparametric bootstrap confidence interval is requested with R bootstrap samples, the model will be fitted R times to these samples, and the standardized moderation effect will be computed in each sample. This ensures that all components used in the computation, including the standard deviations, are also computed from the bootstrapping samples.

Note that the computation can be slow because lavaan::lavaan() or its wrappers will be called R times.

Value

A list of class stdmod_lavaan with these elements:

- stdmod: The standardized moderation effect.
- ci: The nonparametric bootstrap confidence interval. NA if confidence interval not requested.
- boot_out: The raw output from boot::boot(). NA if confidence interval not requested.
- fit: The original fit object.

Author(s)

Shu Fai Cheung https://orcid.org/0000-0002-9871-9448

References

Cheung, S. F., Cheung, S.-H., Lau, E. Y. Y., Hui, C. H., & Vong, W. N. (2022) Improving an old way to measure moderation effect in standardized units. Advance online publication. *Health Psychology*. doi:10.1037/hea0001188

```
#Load a test data of 500 cases
dat <- test_mod1</pre>
library(lavaan)
mod <-
med \sim iv + mod + iv:mod + cov1
dv \sim med + cov2
fit <- sem(mod, dat)</pre>
# Compute the standardized moderation effect
out_noboot <- stdmod_lavaan(fit = fit,</pre>
                              x = "iv",
                              y = "med",
                              w = "mod",
                              x_w = "iv:mod")
out_noboot
# Compute the standardized moderation effect and
# its percentile confidence interval using
# nonparametric bootstrapping
set.seed(8479075)
system.time(out_boot <- stdmod_lavaan(fit = fit,</pre>
                                        x = "iv",
                                        y = "med",
                                        w = "mod",
                                        x_w = "iv:mod",
                                        boot_ci = TRUE,
                                        R = 50)
# In real analysis, R should be at least 2000.
out_boot
```

Description

Standardize, mean center, or scale by standard deviation selected variables in a regression model and refit the model

Usage

```
std_selected(lm_out, to_scale = NULL, to_center = NULL)
std_selected_boot(
  lm_out,
  conf = 0.95,
  nboot = 100,
 boot_args = NULL,
  save_boot_est = TRUE,
  full_output = FALSE
)
```

Arguments

O	
lm_out	The output from $lm()$.
to_scale	The terms to be rescaled by standard deviation, specified by a formula as in $lm()$. For example, if the terms to be scaled are $x1$ and $x3$, use $\sim x1 + x3$. No need to specify the interaction term. To scale the outcome variable, list it on the <i>right hand side</i> as a predictor. Specify only the original variables. If NULL, then no terms will be rescaled by their standard deviations. Variables that are not numeric will be ignored. Default is NULL.
to_center	The terms to be mean centered, specified by a formula as in $lm()$. For example, if the terms to be centered is x1 and x3, use \sim x1 + x3. No need to specify the interaction term. To center the outcome variable, list it on the <i>right hand side</i> as a predictor. Specify only the original variables. If NULL, then no term will be centered. Default is NULL.
	Arguments to be passed to std_selected().

The level of confidence for the confidence interval. Default is .95. conf

nboot The number of bootstrap samples. Default is 100.

A named list of arguments to be passed to boot::boot(). Default is NULL. boot_args

If TRUE, the default, the bootstrap estimates will be saved in the element boot_est save_boot_est

of the output.

full_output Whether the full output from boot::boot() is returned. Default is FALSE. If

TRUE, the full output from boot::boot() will be saved in the element boot_out

of the output.

Details

std_selected() was originally developed to compute the standardized moderation effect and the standardized coefficients for other predictors given an lm() output (Cheung, Cheung, Lau, Hui, &

Vong, 2022). It has been extended such that users can specify which variables in a regression model are to be mean-centered and/or rescaled by their standard deviations. If the model has one or more interaction terms, they will be formed after the transformation, yielding the correct standardized solution for a moderated regression model. Moreover, categorical predictors will be automatically skipped in mean-centering and rescaling.

Standardization is conducted when a variable is mean-centered and then rescaled by its standard deviation. Therefore, if the goal is to get the standardized solution of a moderated regression, users just instruct the function to standardize all non-categorical variables in the regression model.

std_selected_boot() is a wrapper of std_selected(). It calls std_selected() once for each bootstrap sample, and then computes the nonparametric bootstrap percentile confidence intervals (Cheung, Cheung, Lau, Hui, & Vong, 2022).

This function intentionally does not have an argument for setting the seed for random number. Users are recommended to set the seed, e.g., using set.seed() before calling it, to ensure reproducibility.

Value

The updated lm() output, with the class $std_selected$ added. It will be treated as a usual lm() object by most functions. These are the major additional element in the list:

- scaled_terms: If not NULL, a character vector of the variables scaled.
- centered_terms: If not NULL, a character vector of the variables mean-centered.
- scaled_by: A numeric vector of the scaling factors for all the variables in the model. The value is 1 for terms not scaled.
- centered_by: A numeric vector of the numbers used for centering for all the variables in the model. The value is 0 for terms not centered.
- std_selected_call: The original call.
- lm_out_call: The call in lm_out.

Like std_selected(), std_selected_boot() returns the updated lm() output, with the class std_selected added. The output of std_selected_boot() contain these additional elements in the list:

- boot_ci: A data frame of the bootstrap confidence intervals of the regression coefficient.
- nboot: The number of bootstrap samples requested.
- conf: The level of confidence, in proportion.
- boot_est: A matrix of the bootstrap estimates of the regression coefficients. The number of rows equal to nboot, and the number of columns equal to the number of terms in the regression model.
- $std_selected_boot_call$: The call to $std_selected_boot()$.
- boot_out: If available, the original output from boot::boot().

Functions

- std_selected: The base function to center or scale selected variables in a regression model
- std_selected_boot: A wrapper of std_selected() that forms nonparametric bootstrap confidence intervals.

Author(s)

Shu Fai Cheung https://orcid.org/0000-0002-9871-9448

References

Cheung, S. F., Cheung, S.-H., Lau, E. Y. Y., Hui, C. H., & Vong, W. N. (2022) Improving an old way to measure moderation effect in standardized units. Advance online publication. *Health Psychology*. doi:10.1037/hea0001188

```
# Load a sample data set
dat <- test_x_1_w_1_v_1_cat1_n_500
head(dat)
# Do a moderated regression by lm
lm_raw \leftarrow lm(dv \sim iv*mod + v1 + cat1, dat)
summary(lm_raw)
# Mean center mod only
lm_cw <- std_selected(lm_raw, to_center = ~ mod)</pre>
summary(lm_cw)
# Mean center mod and iv
lm_cwx <- std_selected(lm_raw, to_center = ~ mod + iv)</pre>
summary(lm_cwx)
# Standardize both mod and iv
lm_stdwx <- std_selected(lm_raw, to_scale = ~ mod + iv,</pre>
                                 to_center = \sim mod + iv)
summary(lm_stdwx)
# Standardize all variables except for categorical variables.
# Interaction terms are formed after standardization.
lm_std <- std_selected(lm_raw, to_scale = ~ .,</pre>
                                 to_center = ~ .)
summary(lm_std)
dat <- test_x_1_w_1_v_1_cat1_n_500
head(dat)
# Do a moderated regression by lm
lm_raw \leftarrow lm(dv \sim iv*mod + v1 + cat1, dat)
summary(lm_raw)
# Standardize all variables as in std_selected above, and compute the
# nonparametric bootstrapping percentile confidence intervals.
lm_std_boot <- std_selected_boot(lm_raw,</pre>
                                   to_scale = \sim .,
                                   to_center = ~ .,
```

summary.std_selected

summary.std_selected Summary Method for a 'std_selected' Class Object

Description

Summarize the results of std_selected() or std_selected_boot().

Usage

```
## S3 method for class 'std_selected'
summary(object, ...)
```

Arguments

```
object The output of std_selected() or std_selected_boot().
... Additional arguments. Ignored by this function.
```

Value

An object of class summary.std_selected, with bootstrap confidence intervals added if present in the object. The object is a list. Its main element coefficients is similar to the coefficient table in the summary() printout of lm(). This object is for printing summary information of the results from std_selected() or std_selected_boot().

Author(s)

```
Shu Fai Cheung https://orcid.org/0000-0002-9871-9448
```

test_mod1 29

 $test_mod1$

Sample Dataset: A Path Model With A Moderator

Description

For testing. Generated from the following model.

```
mod <-
"
med ~ iv + mod + iv:mod + cov1
dv ~ med + cov2
"</pre>
```

Usage

 $test_mod1$

Format

A data frame with 300 rows and 6 variables:

dv Dependent variable, continuous

iv Independent variable, continuous

med Mediator, continuous

mod Moderator, continuous

cov1 Covariate, continuous

cov2 Covariate, continuous

30 test_mod3_miss

test_mod2

Sample Dataset: A Path Model With A Moderator

Description

For testing. Generated from the following model.

```
mod <-
"
med ~ iv + cov1
dv ~ med + mod + med:mod + cov2
"</pre>
```

Usage

```
test_mod2
```

Format

A data frame with 300 rows and 6 variables:

dv Dependent variable, continuous

iv Independent variable, continuous

med Mediator, continuous

mod Moderator, continuous

cov1 Covariate, continuous

cov2 Covariate, continuous

test_mod3_miss

Sample Dataset: A Path Model With A Moderator

Description

For testing the handling of warnings in stdmod_lavaan(). Generated from the following model. dv has about 88% missing. A warning on missing data will be raised in some bootstrap samples.

```
mod <-
"
med ~ iv + mod + iv:mod + cov1
dv ~ med + cov2
"</pre>
```

Usage

```
test_mod3_miss
```

31

Format

A data frame with 500 rows and 6 variables:

dv Dependent variable, continuous

iv Independent variable, continuous

med Mediator, continuous

mod Moderator, continuous

cov1 Covariate, continuous

cov2 Covariate, continuous

test_x_1_w_1_v_1_cat1_n_500

Sample Dataset: One IV, One Moderator, Two Covariates

Description

A covariate (cat1) is categorical. For testing.

Usage

Format

A data frame with 500 rows and five variables:

dv Dependent variable, continuous

iv Independent variable, continuous

mod Moderator variable, continuous

v1 Covariate, continuous

cat1 Covariate, categorical (string) with three values: "gp1", "gp2", and "gp3"

test_x_1_w_1_v_1_cat1_xw_cov_n_500

Sample Dataset: One IV, One Moderator, Two Covariates

Description

The independent variable and the moderator are associated. For demonstrating the use of tumble graph.

Usage

Format

A data frame with 500 rows and 5 variables:

dv Dependent variable, continuous

iv Independent variable, continuous

mod Moderator variable, continuous

v1 Covariate, continuous

cat1 Covariate, categorical (string) with three values, "gp1", "gp2", and "gp3"

test_x_1_w_1_v_1_cat1_xw_cov_wcat3_n_500

Sample Dataset: One IV, One 3-Category Moderator, Two Covariates

Description

The independent variable and the categorical moderator are associated. For demonstrating the use of tumble graph.

Usage

Format

A data frame with 500 rows and 5 variables:

dv Dependent variable, continuous

iv Independent variable, continuous

mod Moderator variable, categorical (string) with three categories, "City Alpha", "City Gamma", and "City Beta"

v1 Covariate, continuous

cat1 Covariate, categorical (string) with three values, "gp1", "gp2", and "gp3"

```
test_x_1_w_1_v_2_n_500
```

Sample Dataset: One IV, One Moderator, Two Covariates

Description

All variables are continuous. For testing.

Usage

```
test_x_1_w_1_v_2_n_500
```

Format

A data frame with 500 rows and five variables:

dv Dependent variable, continuous

iv Independent variable, continuous

mod Moderator variable, continuous

v1 Covariate, continuous

v2 Covariate, continuous

update.std_selected

The 'update' Method for a 'std_selected' Class Object

Description

This should be used only to update the call to lm(), not to the call to $std_selected()$ or $std_selected_boot()$.

Usage

```
## S3 method for class 'std_selected'
update(object, formula., ..., evaluate = TRUE)
```

Arguments

object The output of the class std_selected().

formula. Changes to the formula.

... Optional arguments to be changed. evaluate Whether the call will be evaluated.

34 vcov.std_selected

Details

Although supported, it is not recommended to update an analysis processed by std_selected() or std_selected_boot(). It is recommended to call lm() again and pass the output to std_selected() or std_selected_boot().

Value

If evaluate = TRUE, it returns the updated fitted object, otherwise, the updated call.

Author(s)

```
Shu Fai Cheung https://orcid.org/0000-0002-9871-9448
```

Examples

vcov.std_selected

The 'vcov' Method for a 'std_selected' Class Object

Description

Compute the variance-covariance matrix of estimates in the output of std_selected() or std_selected_boot().

Usage

```
## S3 method for class 'std_selected'
vcov(object, type = "lm", ...)
```

vcov.std_selected 35

Arguments

object	The output of std_selected() or std_selected_boot().
type	The type of variance-covariance matrix. Default is "lm", returned by the $stats::vcov()$ method for the output of $lm()$. If set to "boot", the variance-covariance matrix of the bootstrap estimates is returned.
	Arguments to be passed to stats::vcov().

Details

If bootstrapping was used to form the confidence intervals, users can request the variance-covariance matrix of the bootstrap estimates.

Value

A matrix of the variances and covariances of the parameter estimates.

Author(s)

```
Shu Fai Cheung https://orcid.org/0000-0002-9871-9448
```

```
# Load a sample data set
dat <- test_x_1_w_1_v_1_cat1_n_500
head(dat)
# Do a moderated regression by lm
lm_raw \leftarrow lm(dv \sim iv*mod + v1 + cat1, dat)
# Standardize all variables except for categorical variables.
# Interaction terms are formed after standardization.
lm_std <- std_selected(lm_raw, to_scale = ~ .,</pre>
                                to_center = ~ .)
# VCOV of lm output
vcov(lm_std)
# Standardize all variables as in std_selected above, and compute the
# nonparametric bootstrapping percentile confidence intervals.
lm_std_boot <- std_selected_boot(lm_raw,</pre>
                                  to_scale = \sim .,
                                  to_center = ~ .,
                                  conf = .95,
                                  nboot = 100)
# In real analysis, nboot should be at least 2000.
# VCOV of lm output
vcov(lm_std_boot)
# VCOV of bootstrap estimates
```

36 vcov.std_selected

vcov(lm_std_boot, type = "boot")

Index

```
print.stdmod_lavaan, 15
* datasets
    sleep_emo_con, 19
                                              print.summary.std_selected, 18
    test_mod1, 29
                                              set.seed(), 6, 26
    test_mod2, 30
                                              sleep_emo_con, 19
    test_mod3_miss, 30
                                              stats::lm(), 5, 11
    test_x_1_w_1_v_1_cat1_n_500, 31
                                              stats::vcov(), 35
    test_x_1_w_1_v_1_cat1_xw_cov_n_500,
                                              std_selected, 24
    26, 28, 33–35
        32
                                              std_selected_boot (std_selected), 24
    test_x_1_w_1_v_2_n_500, 33
                                              std_selected_boot(), 2, 5, 6, 9-11, 17, 18,
add1(), 2
                                                      20, 26, 28, 33–35
add1.std_selected, 2
                                              stdmod, 19
                                              stdmod(), 20, 21
boot::boot(), 5, 6, 20, 21, 23, 25
                                              stdmod_boot (stdmod), 19
boot::boot.ci(), 21
                                              stdmod_boot(), 20, 21
                                              stdmod_lavaan, 22
coef.stdmod_lavaan, 3
                                              stdmod_lavaan(), 3, 8, 15, 16, 23, 30
cond_effect, 4
                                              summary(), 18, 28
cond_effect(), 5-7, 14
                                              summary.lm(), 9
cond_effect_boot (cond_effect), 4
                                              summary.std_selected, 28
cond_effect_boot(), 6, 14
confint(), 9
                                              test_mod1, 29
confint.std_selected, 9
                                              test_mod2, 30
confint.stdmod_lavaan, 8
                                              test_mod3_miss, 30
                                              test_x_1_w_1_v_1_cat1_n_500, 31
ggplot2, 13
                                              test_x_1_w_1_v_1_cat1_xw_cov_n_500, 32
ggplot2::geom_point(), 13
                                              test_x_1_w_1_v_1_cat1_xw_cov_wcat3_n_500,
ggplot2::geom_segment(), 13
                                                      32
                                              test_x_1_w_1_v_2_n_500, 33
lavaan::lavaan, 23
lavaan::lavaan(), 22, 23
                                              update.std_selected, 33
lavaan::lavInspect(), 23
lavaan::sem(), 23
                                              vcov.std_selected, 34
lm(), 2, 9, 20, 21, 25, 26, 28, 33–35
plotmod, 11
print.cond_effect, 14
print.lm(), 17
print.std_selected, 17
```