

# Package ‘autovi’

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**Description** Provides automated visual inference of residual plots using computer vision models, facilitating diagnostic checks for classical normal linear regression models.

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**Author** Weihao Li [aut, cre, cph] (<<https://orcid.org/0000-0003-4959-106X>>)

**Maintainer** Weihao Li <llreczx@gmail.com>

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---

 AUTO\_VI

*AUTO\_VI class environment*


---

**Description**

This is the class of auto visual inference, inherited from [bandicoot::BASE](#). It is an environment with S3 class `bandicoot_oop`.

**Usage**

```
auto_vi(  
  fitted_model,  
  keras_model = NULL,  
  data = NULL,  
  node_index = 1L,  
  env = new.env(parent = parent.frame()),  
  init_call = sys.call()  
)
```

**Arguments**

<code>fitted_model</code>	Model. A model object, e.g. <code>lm</code> .
<code>keras_model</code>	Keras model. A trained computer vision model.
<code>data</code>	Data frame. The data used to fit the model.
<code>node_index</code>	Integer. An index indicating which node of the output layer contains the visual signal strength. This is particularly useful when the keras model has more than one output nodes.
<code>env</code>	Environment. The instance environment.
<code>init_call</code>	Call. Contents of the <code>..init_call...</code> . It is recommended to leave it as default.

**Value**

An instance environment.

**Functions**

- `auto_vi()`: Class constructor, same as `AUTO_VI$instantiate()`.

**Class information****Parent classes:**

- Direct:
  - [bandicoot::BASE](#)

**New attributes:**

- C:
  - [AUTO\\_VI\\$check\\_result](#)

**New methods:**

- A:
  - [AUTO\\_VI\\$auxiliary\(\)](#)
- B:
  - [AUTO\\_VI\\$boot\\_vss\(\)](#)
- C:
  - [AUTO\\_VI\\$check\(\)](#)

- F:
  - AUTO\_VI\$feature\_pca()
  - AUTO\_VI\$feature\_pca\_plot()
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- S:
  - AUTO\_VI\$select\_feature()
  - AUTO\_VI\$.str..()
  - AUTO\_VI\$summary\_density\_plot()
  - AUTO\_VI\$summary\_plot()
  - AUTO\_VI\$summary\_rank\_plot()
- V:
  - AUTO\_VI\$vss()

---

AUTO\_VI\$.init..      *Initialization method*

---

### Description

This function will be called after an instance is built. User input will be stored in the environment.

#### Usage:

```
AUTO_VI$.init..(fitted_model, keras_model = NULL, data = NULL, node_index = 1L)
```

### Arguments

fitted_model	Model. A model object, e.g. lm.
keras_model	Keras model. A trained computer vision model.
data	Data frame. The data used to fit the model.
node_index	Integer. An index indicating which node of the output layer contains the visual signal strength. This is particularly useful when the keras model has more than one output nodes.

**Value**

Return the object itself.

**Examples**

```
my_vi <- auto_vi(fitted_model = lm(speed ~ dist, data = cars))
my_vi
```

---

AUTO\_VI\$.str..      *String representation of the object*

---

**Description**

This function returns a string representation of the object.

**Usage:**

```
AUTO_VI$.str..()
```

**Value**

A string.

**Examples**

```
AUTO_VI$.str..()

my_vi <- auto_vi(fitted_model = lm(speed ~ dist, data = cars))
my_vi$.str..()
```

---

AUTO\_VI\$auxiliary      *Compute auxiliary variables for the keras model*

---

**Description**

This function computes auxiliary variables including monotonic measure (`measure_monotonic`), sparse measure (`measure_sparse`), splines measure (`measure_splines`), striped measure (`measure_striped`), and the number of observation (`n`). Scagnostics are computed using `cassowary::sc_monotonic()`, `cassowary::sc_sparse2()`, `cassowary::sc_splines()`, and `cassowary::sc_striped()`.

If you wish to calculate additional auxiliary variables for your keras model, please override this method. Ensure that it accepts a data frame with columns named `.fitted` and `.resid` as input and returns a single row tibble.

**Usage:**

```
AUTO_VI$auxiliary(data = self$get_fitted_and_resid())
```

**Arguments**

`data` Data frame. A data frame containing variables `.resid` and `.fitted`. See also [AUTO\\_VI\\$get\\_fitted\\_and\\_resid\(\)](#).

**Value**

A tibble.

**Examples**

```
my_vi <- auto_vi(fitted_model = lm(speed ~ dist, data = cars))
my_vi$auxiliary()
```

---

AUTO\_VI\$boot\_vss      *Predict visual signal strength for bootstrapped residual plots*

---

**Description**

This function bootstrap the data and refits the model, then predicts the visual signal strength of the bootstrapped residual plots.

**Usage:**

```
AUTO_VI$boot_vss(
  draws = 100L,
  fitted_model = self$fitted_model,
  keras_model = self$keras_model,
  data = self$get_data(),
  node_index = 1L,
  keep_boot_data = FALSE,
  keep_boot_plot = FALSE,
  extract_feature_from_layer = NULL
)
```

**Arguments**

`draws` Integer. Number of simulation draws.

`fitted_model` Model. A model object, e.g. `lm`.

`keras_model` Keras model. A trained computer vision model.

`data` Data frame. The data used to fit the model. See also [AUTO\\_VI\\$get\\_data\(\)](#).

`node_index` Integer. An index indicating which node of the output layer contains the visual signal strength. This is particularly useful when the keras model has more than one output nodes.

`keep_boot_data` Boolean. Whether to keep the bootstrapped data.

`keep_boot_plot` Boolean. Whether to keep the bootstrapped plots.

`extract_feature_from_layer` Character/Integer. A layer name or an integer layer index for extracting features from a layer.

**Value**

A tibble.

**Examples**

```
keras_model <- try(get_keras_model("vss_phn_32"))
if (!inherits(keras_model, "try-error")) {
  myvi <- auto_vi(lm(dist ~ speed, data = cars), keras_model)

  myvi$boot_vss()
}
```

---

AUTO\_VI\$check

*Conduct a auto visual inference check with a computer vision model*

---

**Description**

This function conducts a visual inference check with a computer vision model. The result will be stored in `self$check_result`.

**Usage:**

```
AUTO_VI$check(
  null_draws = 100L,
  boot_draws = 100L,
  fitted_model = self$fitted_model,
  keras_model = self$keras_model,
  null_method = self>null_method,
  p_value_type = "quantile",
  data = self$get_data(),
  node_index = self$node_index,
  keep_data = FALSE,
  keep_plot = FALSE,
  extract_feature_from_layer = NULL
)
```

**Arguments**

<code>null_draws</code>	Integer. Number of simulation draws for <a href="#">AUTO_VI&gt;null_vss()</a> .
<code>boot_draws</code>	Integer. Number of simulation draws for <a href="#">AUTO_VI\$boot_vss()</a> .
<code>fitted_model</code>	Model. A model object, e.g. <code>lm</code> .
<code>keras_model</code>	Keras model. A trained computer vision model.
<code>null_method</code>	Function. A method to simulate residuals from the null hypothesis distribution. For <code>lm</code> , the recommended method is residual rotation <a href="#">AUTO_VI\$rotate_resid()</a> .
<code>p_value_type</code>	Character. Either "quantile" or "lineup". See also <a href="#">AUTO_VI\$p_value()</a> .
<code>data</code>	Data frame. The data used to fit the model. See also <a href="#">AUTO_VI\$get_data()</a> .

node_index	Integer. An index indicating which node of the output layer contains the visual signal strength. This is particularly useful when the keras model has more than one output nodes.
keep_data	Boolean. Whether to keep the simulated data.
keep_plot	Boolean. Whether to keep the simulated plots.
extract_feature_from_layer	Character/Integer. A layer name or an integer layer index for extracting features from a layer.

**Value**

Return the object itself.

**Examples**

```
keras_model <- try(get_keras_model("vss_phn_32"))
if (!inherits(keras_model, "try-error")) {
  myvi <- auto_vi(lm(dist ~ speed, data = cars), keras_model)

  myvi$check()
  myvi
}
```

---

AUTO\_VI\$check\_result *List of diagnostic results*

---

**Description**

A list, will be initialized after the method [AUTO\\_VI\\$check\(\)](#) is run.

---

AUTO\_VI\$feature\_pca *Conduct principal component analysis for features extracted from keras model*

---

**Description**

This function conducts principal component analysis for features extracted from keras model.

**Usage:**

```
AUTO_VI$feature_pca(
  feature = self$select_feature(self$check_result$observed),
  null_feature = self$select_feature(self$check_result$null),
  boot_feature = self$select_feature(self$check_result$boot),
  center = TRUE,
  scale = TRUE
)
```



**Arguments**

feature	Dataframe. A data frame where columns represent features and rows represent observations. It should have only one row.
null_feature	Dataframe. A data frame where columns represent features and rows represent observations. These features are extracted during the evaluation of null plots.
boot_feature	Dataframe. A data frame where columns represent features and rows represent observations. These features are extracted during the evaluation of bootstrapped plots.
center	Boolean. Whether to subtract the mean from the feature.
scale	Boolean. Whether to divide the feature by its standard deviation.

**Details**

Features need to be extracted while running the method `AUTO_VI$check()` and `AUTO_VI$lineup_check()` by providing the argument `extract_feature_from_layer`. Features with zero variance will be ignored from the analysis. See also `stats::prcomp()`.

**Value**

A tibble of the raw features and the rotated features with attributes `sdev` and `rotation` representing the standard deviation of the principal components and the rotation matrix respectively.

**Examples**

```
keras_model <- try(get_keras_model("vss_phn_32"))
if (!inherits(keras_model, "try-error")) {
  myvi <- auto_vi(lm(dist ~ speed, data = cars), keras_model)

  myvi$lineup_check(extract_feature_from_layer = "global_max_pooling2d")
  myvi$feature_pca()
}
```

---

AUTO\_VI\$feature\_pca\_plot

*Draw a summary Plot for principal component analysis conducted on extracted features*

---

**Description**

This function draws a summary Plot for principal component analysis conducted on extracted features

**Usage:**

```
AUTO_VI$feature_pca_plot(
  feature_pca = self$feature_pca(),
  x = PC1,
  y = PC2,
  col_by_set = TRUE)
```

### Arguments

feature_pca	Dataframe. A data frame containing the rotated features.
x	Symbol. The x variable. See also <a href="#">ggplot2::tidyeval</a> .
y	Symbol. The y variable. See also <a href="#">ggplot2::tidyeval</a> .
col_by_set	Booleana. Whether to color points by sets (observed, null, and boot).

### Details

By default, it will visualize PC2 vs PC1. User can choose to visualize other principal components.

### Value

A ggplot.

### Examples

```
keras_model <- try(get_keras_model("vss_phn_32"))
if (!inherits(keras_model, "try-error")) {
  myvi <- auto_vi(lm(dist ~ speed, data = cars), keras_model)

  myvi$lineup_check(extract_feature_from_layer = "global_max_pooling2d")
  myvi$feature_pca_plot()
}
```

---

AUTO\_VI\$get\_data      *Get data out of a model object*

---

### Description

This function gets the data out of a model object by using `stats::model.frame()` if `self$data` is NULL.

#### Usage:

```
AUTO_VI$get_data(fitted_model = self$fitted_model)
```

### Arguments

fitted_model	Model. A model object, e.g. lm.
--------------	---------------------------------

**Value**

A tibble.

**Examples**

```
my_vi <- auto_vi(fitted_model = lm(speed ~ dist, data = cars))
my_vi$get_data()
```

---

AUTO\_VI\$get\_fitted\_and\_resid

*Get fitted values and residuals out of a model object*

---

**Description**

This function gets fitted values and residuals out of a model object by using `stats::fitted()` and `stats::resid()`.

**Usage:**

```
AUTO_VI$get_fitted_and_resid(fitted_model = self$fitted_model)
```

**Arguments**

`fitted_model` Model. A model object, e.g. `lm`.

**Value**

A tibble.

**Examples**

```
my_vi <- auto_vi(fitted_model = lm(speed ~ dist, data = cars))
my_vi$get_fitted_and_resid()
```

---

AUTO\_VI\$likelihood\_ratio

*Compute the likelihood ratio using the simulated result*

---

**Description**

This function estimates the likelihood of observing the visual signal strength in terms of the bootstrapped distribution and the simulated null distribution, and computes the ratio between these two likelihood.

**Usage:**

```
AUTO_VI$likelihood_ratio(
  vss = self$check_result$observed$vss,
  dist_1 = self$check_result$boot$vss,
  dist_2 = self$check_result$null$vss
)
```

**Arguments**

vss	Numeric. The observed visual signal strength.
dist_1	Numeric. A vector of visual signal strength for plots following the first distribution (bootstrap distribution by default).
dist_2	Numeric. A vector of visual signal strength for plots following the second distribution (null distribution by default).

**Value**

A named vector with three elements likelihood\_1, likelihood\_2 and likelihood\_ratio.

**Examples**

```
dist_1 <- rnorm(100, 0, 1)
dist_2 <- rnorm(100, 1, 1)
AUTO_VI$likelihood_ratio(0, dist_1, dist_2)
```

---

AUTO\_VI\$lineup\_check    *Conduct a auto visual inference lineup check with a computer vision model*

---

**Description**

This function conducts a visual inference lineup check with a computer vision model. The result will be stored in self\$check\_result.

**Usage:**

```
AUTO_VI$lineup_check(
  lineup_size = 20L,
  fitted_model = self$fitted_model,
  keras_model = self$keras_model,
  null_method = self$null_method,
  data = self$get_data(),
```

```

    node_index = self$node_index,
    extract_feature_from_layer = NULL
  )

```

### Arguments

lineup_size	Integer. Number of plots in a lineup.
fitted_model	Model. A model object, e.g. lm.
keras_model	Keras model. A trained computer vision model.
null_method	Function. A method to simulate residuals from the null hypothesis distribution. For lm, the recommended method is residual rotation <a href="#">AUTO_VI\$rotate_resid()</a> .
data	Data frame. The data used to fit the model. See also <a href="#">AUTO_VI\$get_data()</a> .
node_index	Integer. An index indicating which node of the output layer contains the visual signal strength. This is particularly useful when the keras model has more than one output nodes.
extract_feature_from_layer	Character/Integer. A layer name or an integer layer index for extracting features from a layer.

### Value

Return the object itself.

### Examples

```

keras_model <- try(get_keras_model("vss_phn_32"))
if (!inherits(keras_model, "try-error")) {
  myvi <- auto_vi(lm(dist ~ speed, data = cars), keras_model)

  myvi$lineup_check()
  myvi
}

```

---

AUTO\_VI\$null\_method    *Get null residuals from a fitted model*

---

### Description

This default method gets rotated residuals from a fitted linear model using [AUTO\\_VI\\$rotate\\_resid](#). User needs to override this method if the fitted model is not a linear regression model.

#### Usage:

```
AUTO_VI$null_method(fitted_model = self$fitted_model)
```

**Arguments**

`fitted_model` `lm`. A linear model object.

**Value**

A tibble with two columns `.fitted` and `.resid`.

**Examples**

```
my_vi <- auto_vi(fitted_model = lm(speed ~ dist, data = cars))
null_resid <- my_vi$null_method()
my_vi$plot_resid(null_resid)
```

---

AUTO\_VI\$null\_vss      *Simulate null plots and predict the visual signal strength*

---

**Description**

This function simulates null plots from the null hypothesis distribution, and predicts the visual signal strength.

**Usage:**

```
AUTO_VI$null_vss(
  draws = 100L,
  fitted_model = self$fitted_model,
  keras_model = self$keras_model,
  null_method = self$null_method,
  node_index = self$node_index,
  keep_null_data = FALSE,
  keep_null_plot = FALSE,
  extract_feature_from_layer = NULL
)
```

**Arguments**

`draws` Integer. Number of simulation draws.

`fitted_model` Model. A model object, e.g. `lm`.

`keras_model` Keras model. A trained computer vision model.

`null_method` Function. A method to simulate residuals from the null hypothesis distribution. For `lm`, the recommended method is residual rotation [AUTO\\_VI\\$rotate\\_resid\(\)](#).

`node_index` Integer. An index indicating which node of the output layer contains the visual signal strength. This is particularly useful when the keras model has more than one output nodes.

`keep_null_data` Boolean. Whether to keep the simulated null data.

`keep_null_plot` Boolean. Whether to keep the simulated null plots.

```
extract_feature_from_layer
```

Character/Integer. A layer name or an integer layer index for extracting features from a layer.

### Value

A tibble.

### Examples

```
keras_model <- try(get_keras_model("vss_phn_32"))
if (!inherits(keras_model, "try-error")) {
  myvi <- auto_vi(lm(dist ~ speed, data = cars), keras_model)

  myvi$null_vss()
}
```

---

AUTO\_VI\$plot\_resid      *Draw a standard residual plot*

---

### Description

This function draws a standard residual plot.

#### Usage:

```
AUTO_VI$plot_resid(
  data = self$get_fitted_and_resid(),
  theme = ggplot2::theme_light(base_size = 11/5),
  alpha = 1,
  size = 0.5,
  stroke = 0.5,
  remove_axis = TRUE,
  remove_legend = TRUE,
  remove_grid_line = TRUE,
  add_zero_line = TRUE
)
```

### Arguments

data	Data frame. A data frame containing variables <code>.resid</code> and <code>.fitted</code> . See also <a href="#">AUTO_VI\$get_fitted_and_resid()</a> .
theme	ggtheme. A ggplot theme object. See also <a href="#">ggplot2::theme_light()</a> .
alpha	Numeric. Alpha of dot. Value between 0 and 1.
size	Numeric. Size of dot. Value between 0 and 1.
stroke	Numeric. Stroke of dot. Value between 0 and 1.
remove_axis	Boolean. Whether or not to remove the axis.

remove\_legend Boolean. Whether or not to remove the legend.  
 remove\_grid\_line Boolean. Whether or not to remove the grid lines.  
 add\_zero\_line Boolean. Whether or not to add a zero horizontal line.

**Value**

A ggplot.

**Examples**

```
my_vi <- auto_vi(fitted_model = lm(speed ~ dist, data = cars))
my_vi$plot_resid()
```

---

AUTO_VI\$p_value	<i>Compute the p-value based on the check result</i>
------------------	--

---

**Description**

This function computes the p-value of observing the visual signal strength of the original residual plot based on the null distribution.

**Usage:**

```
AUTO_VI$p_value(  
  vss = self$check_result$observed$vss,  
  null_dist = self$check_result$null$vss,  
  type = "auto"  
)
```

**Arguments**

type Character. Either "auto", "quantile" or "lineup". Option "auto" will use the Boolean flag self\$check\_result\$lineup\_check to determine the correct option.

**Details**

There are two types of p-value calculation. Option "quantile" calculates the percentage of null visual signal strength greater than or equal to the observed visual signal strength. Option "lineup" combines the null visual signal strength and the observed visual signal strength in one vector, and calculates the percentage of entries in this vector greater than or equal to the observed visual signal strength. The "lineup" option ensures the p-value will not be smaller than 1 over the size of the lineup.

**Value**

A numeric value representing the desired p-value.



**Examples**

```
vss <- 1
null_dist <- rnorm(100, 0, 1)
AUTO_VI$p_value(vss, null_dist)
```

---

AUTO\_VI\$rotate\_resid *Get rotated residuals from a fitted linear model*

---

**Description**

This function gets rotated residuals from a fitted linear model. The rotated residuals are generated by first regressing random noises on the original regressors, then multiply the obtained residuals by original RSS divided by the current RSS. The results are the rotated residuals.

**Usage:**

```
AUTO_VI$rotate_resid(fitted_model = self$fitted_mod)
```

**Arguments**

fitted\_model    lm. A linear model object.

**Value**

A tibble with two columns .fitted and .resid.

**Examples**

```
my_vi <- auto_vi(fitted_model = lm(speed ~ dist, data = cars))
rotated_resid <- my_vi$rotate_resid()
my_vi$plot_resid(rotated_resid)
```

---

AUTO\_VI\$select\_feature

*Select features from the check result*

---

**Description**

This function select features from the check result.

**Usage:**

```
AUTO_VI$feature_pca(data = self$check_result$observed, pattern = "f_")
```

**Arguments**

data	Dataframe. A data frame where some columns represent features and rows represent observations.
pattern	Character. A regex pattern to search for features. See also <a href="#">grep()</a> .

**Details**

By default, features are assumed to follow the naming convention "f\_(index)", where index is from one to the number of features.

**Value**

A tibble where columns represent features and rows represent observations.

**Examples**

```
keras_model <- try(get_keras_model("vss_phn_32"))
if (!inherits(keras_model, "try-error")) {
  myvi <- auto_vi(lm(dist ~ speed, data = cars), keras_model)

  myvi$lineup_check(extract_feature_from_layer = "global_max_pooling2d")
  myvi$select_feature()
}
```

---

AUTO\_VI\$summary\_density\_plot

*Draw a summary density plot for the result*

---

**Description**

This function draws a summary density plot for the result.

**Usage:**

```
AUTO_VI$summary_plot(
  vss = self$check_result$observed$vss,
  null_dist = self$check_result$null$vss,
  boot_dist = self$check_result$boot$vss,
  p_value = self$check_result$p_value,
  likelihood_ratio = self$check_result$likelihood_ratio,
  density_alpha = 0.6
)
```

**Arguments**

vss	Numeric. Observed visual signal strength.
null_dist	Numeric. Null visual signal strength.
boot_dist	Numeric. Bootstrapped visual signal strength.
p_value	Numeric. P-value of the visual test. See also <a href="#">AUTO_VI\$p_value()</a> .
likelihood_ratio	Numeric. Likelihood ratio of the visual test. See also <a href="#">AUTO_VI\$likelihood_ratio()</a> .
density_alpha	Numeric. Alpha value for the density.

**Value**

A ggplot.

**Examples**

```
keras_model <- try(get_keras_model("vss_phn_32"))
if (!inherits(keras_model, "try-error")) {
  myvi <- auto_vi(lm(dist ~ speed, data = cars), keras_model)

  myvi$check()
  myvi$summary_density_plot()
}
```

---

AUTO\_VI\$summary\_plot *Draw a summary plot for the result*

---

**Description**

This function draws a summary plot for the result.

**Usage:**

```
AUTO_VI$summary_plot(type = "auto", ...)
```

**Arguments**

type	Character. Either "auto", "density" or "rank". Option "auto" will use the Boolean flag <code>self\$check_result\$lineup_check</code> to determine the correct option. See also <a href="#">AUTO_VI\$summary_density_plot()</a> and <a href="#">AUTO_VI\$summary_rank_plot()</a> .
...	Arguments passed to <a href="#">AUTO_VI\$summary_density_plot()</a> or <a href="#">AUTO_VI\$summary_rank_plot()</a> .

**Value**

A ggplot.

## Examples

```
keras_model <- try(get_keras_model("vss_phn_32"))
if (!inherits(keras_model, "try-error")) {
  myvi <- auto_vi(lm(dist ~ speed, data = cars), keras_model)

  myvi$lineup_check()
  myvi$summary_plot()
}
```

---

AUTO\_VI\$summary\_rank\_plot

*Draw a summary rank plot for the result*

---

## Description

This function draws a summary rank plot for the result.

### Usage:

```
AUTO_VI$summary_plot(
  vss = self$check_result$observed$vss,
  null_dist = self$check_result$null$vss,
  p_value = self$check_result$p_value
)
```

## Arguments

vss	Numeric. Observed visual signal strength.
null_dist	Numeric. Null visual signal strength.
p_value	Numeric. P-value of the visual test. See also <a href="#">AUTO_VI\$p_value()</a> .

## Value

A ggplot.

## Examples

```
keras_model <- try(get_keras_model("vss_phn_32"))
if (!inherits(keras_model, "try-error")) {
  myvi <- auto_vi(lm(dist ~ speed, data = cars), keras_model)

  myvi$lineup_check()
  myvi$summary_rank_plot()
}
```

---

AUTO\_VI\$vss                      *Predict the visual signal strength*

---

## Description

This function predicts the visual signal strength.

### Usage:

```
AUTO_VI$vss(
  p = self$plot_resid(),
  auxiliary = NULL,
  keras_model = self$keras_model,
  node_index = self$node_index,
  extract_feature_from_layer = NULL
)
```

## Arguments

p	ggplot/List/Data.frame/Array/Numpy array/String. The input can be <ol style="list-style-type: none"> <li>1. a ggplot,</li> <li>2. a list of ggplot,</li> <li>3. a data.frame containing <code>.resid</code> (residuals) and <code>.fitted</code> (fitted values) that can be passed to <code>AUTO_VI\$plot_resid()</code>,</li> <li>4. a 3D array representing an image,</li> <li>5. a 4D array representing one or more images,</li> <li>6. a path to an image,</li> <li>7. a vector or a list of paths to images,</li> <li>8. a numpy array.</li> </ol>
auxiliary	Dataframe. A dataframe of auxiliary values. This is only used when the keras model has multiple inputs. If it is not provided, the values will be automatically computed based on the residual plot of the fitted model. See also <code>AUTO_VI\$auxiliary()</code> .
keras_model	Keras model. A trained computer vision model.
node_index	Integer. An index indicating which node of the output layer contains the visual signal strength. This is particularly useful when the keras model has more than one output nodes.
extract_feature_from_layer	Character/Integer. A layer name or an integer layer index for extracting features from a layer.

## Value

A tibble. The first column is `vss` which is the prediction, the rest of the columns are features extracted from a layer.

**Examples**

```
keras_model <- try(get_keras_model("vss_phn_32"))
if (!inherits(keras_model, "try-error")) {
  myvi <- auto_vi(lm(dist ~ speed, data = cars), keras_model)

  myvi$vss()
}
```

---

```
check_python_library_available
      Check python library availability
```

---

**Description**

This function checks if a python library is available. If the library can not be found by the `importlib.util.find_spec` method, then an error will be throw.

**Usage**

```
check_python_library_available(lib_name)
```

**Arguments**

`lib_name`            Character. A library name.

**Value**

No return. Called for side-effect.

**Examples**

```
try(check_python_library_available("numpy"))
```

---

```
get_keras_model            Download and load the keras model
```

---

**Description**

This functions download the keras model from the `TengMCing/autovi_data` Github repo using [download.file\(\)](#) and load the model using `reticulate::import("tensorflow")$keras$models$load_model`. Note that tensorflow version greater than 2.15 is not supported.

**Usage**

```
get_keras_model(model_name)
```

**Arguments**

`model_name` String. The model name. See also `list_keras_model()`.

**Value**

A keras model.

**Examples**

```
keras_model <- try(get_keras_model("vss_phn_32"))
if (!inherits(keras_model, "try-error")) keras_model$summary()
```

---

KERAS\_WRAPPER

*KERAS\_WRAPPER class environment*

---

**Description**

This is the class of keras wrapper, inherited from `bandicoot::BASE`. It is an environment with S3 class `bandicoot_oop`.

**Usage**

```
keras_wrapper(
  keras_model = NULL,
  node_index = 1L,
  env = new.env(parent = parent.frame()),
  init_call = sys.call()
)
```

**Arguments**

`keras_model` Keras model. A trained computer vision model.

`node_index` Integer. An index indicating which node of the output layer contains the visual signal strength. This is particularly useful when the keras model has more than one output nodes.

`env` Environment. The instance environment.

`init_call` Call. Contents of the `..init_call..` It is recommended to leave it as default.

**Value**

An instance environment.

**Functions**

- `keras_wrapper()`: Class constructor, same as `KERAS_WRAPPER$instantiate()`.

**Class information****Parent classes:**

- Direct:
  - [bandicoot::BASE](#)

**New methods:**

- G:
  - [KERAS\\_WRAPPER\\$get\\_input\\_height\(\)](#)
  - [KERAS\\_WRAPPER\\$get\\_input\\_width\(\)](#)
- I:
  - [KERAS\\_WRAPPER\\$image\\_to\\_array\(\)](#)
  - [KERAS\\_WRAPPER\\$.init..\(\)](#)
- L:
  - [KERAS\\_WRAPPER\\$list\\_layer\\_name\(\)](#)
- P:
  - [KERAS\\_WRAPPER\\$predict\(\)](#)
- S:
  - [KERAS\\_WRAPPER\\$.str..\(\)](#)

---

KERAS\_WRAPPER\$.init..

*Initialization method*

---

**Description**

This function will be called after an instance is built. User input will be stored in the environment.

**Usage:**

`KERAS_WRAPPER$.init..(keras_mod = NULL, node_index = 1L)`

**Arguments**

<code>keras_mod</code>	Keras model. A trained computer vision model.
<code>node_index</code>	Integer. An index indicating which node of the output layer contains the visual signal strength. This is particularly useful when the keras model has more than one output nodes.

**Value**

Return the object itself.

**Examples**

`keras_wrapper()`



---

KERAS\_WRAPPER\$.str.. *String representation of the object*

---

### Description

This function returns a string representation of the object.

#### Usage:

```
KERAS_WRAPPER$.str..()
```

### Value

A string.

### Examples

```
KERAS_WRAPPER$.str..()
wrapper <- keras_wrapper()
wrapper$.str..()
```

---

KERAS\_WRAPPER\$get\_input\_height

*Get keras model input image height*

---

### Description

This function get the input image height (the input shape is (batch\_size, height, width, channels)) of a keras model.

#### Usage:

```
KERAS_WRAPPER$get_input_height(keras_model = self$keras_model)
```

### Arguments

keras\_model      Keras model. A trained computer vision model.

### Value

An integer.

### Examples

```
keras_model <- try(get_keras_model("vss_phn_32"))
if (!inherits(keras_model, "try-error")) {
  keras_wrapper(keras_model)$get_input_height()
}
```

---

`KERAS_WRAPPER$get_input_width`*Get keras model input image width*

---

**Description**

This function get the input image width (the input shape is (batch\_size, height, width, channels)) of a keras model.

**Usage:**

```
KERAS_WRAPPER$get_input_width(keras_model = self$keras_model)
```

**Arguments**

`keras_model` Keras model. A trained computer vision model.

**Value**

An integer.

**Examples**

```
keras_model <- try(get_keras_model("vss_phn_32"))
if (!inherits(keras_model, "try-error")) {
  keras_wrapper(keras_model)$get_input_width()
}
```

---

`KERAS_WRAPPER$image_to_array`*Load an image as numpy array*

---

**Description**

This function loads an image from file and convert it to a numpy array.

**Usage:**

```
KERAS_WRAPPER$image_to_array(
  path,
  height = self$get_input_height(),
  width = self$get_input_width()
)
```

**Arguments**

path            Character. Path to the image.  
 height         Integer. Target height of the image.  
 width          Integer. Target width of the image.

**Value**

A numpy array.

**Examples**

```
p <- ggplot2::ggplot(cars) + ggplot2::geom_point(ggplot2::aes(dist, speed))
path <- save_plot(p)
result <- try(KERAS_WRAPPER$image_to_array(path, 32L, 32L))
if (!inherits(result, "try-error")) {
  result
}
```

---

KERAS\_WRAPPER\$list\_layer\_name

*List all layer names*

---

**Description**

This function list all layer names of a keras model.

**Usage:**

```
KERAS_WRAPPER$list_layer_name(keras_model = self$keras_model)
```

**Arguments**

keras\_model    Keras model. A trained computer vision model.

**Value**

A vector of strings.

**Examples**

```
keras_model <- try(get_keras_model("vss_phn_32"))
if (!inherits(keras_model, "try-error")) {
  keras_wrapper(keras_model)$list_layer_name()
}
```

---

KERAS\_WRAPPER\$predict *Predict visual signal strength*

---

### Description

This function predicts the visual signal strength using the provided keras model, input array and optional auxiliary input array.

#### Usage:

```
KERAS_WRAPPER$predict(
  input_array,
  auxiliary = NULL,
  keras_model = self$keras_model,
  node_index = self$node_index,
  extract_feature_from_layer = NULL
)
```

### Arguments

input_array	Array/Numpy array. An input array, usually of the shape (batch_size, height, width, channels).
auxiliary	Array/Data frame. An auxiliary input array of the shape (batch_size, number_of_auxiliary_inputs). This is only needed if the keras model takes multiple inputs.
keras_model	Keras model. A trained computer vision model.
node_index	Integer. An index indicating which node of the output layer contains the visual signal strength. This is particularly useful when the keras model has more than one output nodes.
extract_feature_from_layer	Character/Integer. A layer name or an integer layer index for extracting features from a layer.

### Value

A tibble. The first column is vss which is the prediction, the rest of the columns are features extracted from a layer.

### Examples

```
keras_model <- try(get_keras_model("vss_phn_32"))
if (!inherits(keras_model, "try-error")) {
  wrapper <- keras_wrapper(keras_model)

  # Provide one 32 * 32 RGB image and one vector of length 5 as input
  wrapper$predict(input_array = array(255, dim = c(1, 32, 32, 3)),
                 auxiliary = matrix(1, ncol = 5))
}
```

---

list_keras_model	<i>List all available pre-trained computer vision models</i>
------------------	--

---

**Description**

This function gets a table of available pre-trained computer vision models for predicting visual signal strength.

**Usage**

```
list_keras_model()
```

**Value**

A tibble of available model names and paths.

**Examples**

```
list_keras_model()
```

---

remove_plot	<i>Remove a plot</i>
-------------	----------------------

---

**Description**

This function removes a plot from a provided path.

**Usage**

```
remove_plot(path, check_ext = TRUE)
```

**Arguments**

path	Character. Path to the image.
check_ext	Boolean. Whether to check the file extension.

**Value**

No return. Called for side-effect.

**Examples**

```
p <- ggplot2::ggplot(cars) + ggplot2::geom_point(ggplot2::aes(dist, speed))
path <- save_plot(p)
remove_plot(path)
```

---

`save_plot`*Save a plot*

---

**Description**

This function save a plot to a provided path.

**Usage**

```
save_plot(p, path = NULL, width = 7/5, height = 7/4, ...)
```

**Arguments**

<code>p</code>	ggplot. A plot.
<code>path</code>	Character. Path to save the image.
<code>width</code>	Numeric. Width of the image.
<code>height</code>	Numeric. Height of the image.
<code>...</code>	Other arguments passed to <code>ggplot2::ggsave()</code> .

**Value**

The image path.

**Examples**

```
p <- ggplot2::ggplot(cars) + ggplot2::geom_point(ggplot2::aes(dist, speed))
save_plot(p)
```

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