Package 'luz'

October 7, 2021

Title Higher Level 'API' for 'torch'

Version 0.2.0

Description A high level interface for 'torch' providing utilities to reduce the the amount of code needed for common tasks, abstract away torch details and make the same code work on both the 'CPU' and 'GPU'. It's flexible enough to support expressing a large range of models. It's heavily inspired by 'fastai' by Howard et al. (2020) <arXiv:2002.04688>, 'Keras' by Chollet et al. (2015) and 'Pytorch Lightning' by Falcon et al. (2019) <doi:10.5281/zenodo.3828935>.

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URL https://mlverse.github.io/luz/, https://github.com/mlverse/luz

Encoding UTF-8 **RoxygenNote** 7.1.1

Imports torch (>= 0.5.0), magrittr, zeallot, rlang, coro, glue, progress, R6, generics, purrr, ellipsis, fs, prettyunits, cli

Suggests knitr, rmarkdown, testthat (>= 3.0.0), covr, Metrics, withr, vdiffr, ggplot2, dplyr

VignetteBuilder knitr

Config/testthat/edition 3

Collate 'accelerator.R' 'as_dataloader.R' 'utils.R' 'callbacks.R' 'callbacks-interrupt.R' 'callbacks-monitor-metrics.R' 'callbacks-profile.R' 'context.R' 'lr-finder.R' 'metrics.R' 'metrics-auc.R' 'module-plot.R' 'module-print.R' 'module.R' 'reexports.R' 'serialization.R'

NeedsCompilation no

Author Daniel Falbel [aut, cre, cph], RStudio [cph]

Maintainer Daniel Falbel <daniel@rstudio.com>

Repository CRAN

Date/Publication 2021-10-07 20:50:02 UTC

2 accelerator

R topics documented:

acce	lerator Create an accelerator	
Index		39
	ос_орт_пришпо	
	set opt hparams	37
	set hparams	37
	setup	36
	predict.luz_module_fitted	35
	luz_save	34
	luz metric rmse	34
	luz_metric_multiclass_auroc	32
	luz_metric_mse	32
	luz_metric_mae	31
	luz_metric_binary_accuracy_with_logits	30
	luz_metric_binary_accuracy	28 29
	luz_metric_accuracy	2728
	luz_metric	25
	luz_load_model_weights	24
	luz_load	24
	luz_callback_train_valid	23
	luz_callback_progress	23
	luz_callback_profile	22
	luz_callback_model_checkpoint	20
	luz_callback_metrics	20
	luz_callback_lr_scheduler	19
	luz_callback_interrupt	18
	luz_callback_early_stopping	17
	luz_callback_csv_logger	16
	luz_callback	14
	lr_finder	13
	get_metrics	12
	fit.luz_module_generator	11
	evaluate	9
	ctx	8
	context	4
	as_dataloader	3
	accelerator	- 2

Description

Create an accelerator

as_dataloader 3

Usage

```
accelerator(
  device_placement = TRUE,
  cpu = FALSE,
  cuda_index = torch::cuda_current_device()
)
```

Arguments

device_placement

(logical) whether the accelerator object should handle device placement. De-

fault: TRUE

cpu (logical) whether the training procedure should run on the CPU.

cuda_index (integer) index of the CUDA device to use if multiple GPUs are available. De-

fault: the result of torch::cuda_current_device().

as_dataloader

Creates a dataloader from its input

Description

as_dataloader is used internally by luz to convert input data and valid_data as passed to fit.luz_module_generator() to a torch::dataloader

Usage

```
as_dataloader(x, ...)
## S3 method for class 'dataset'
as_dataloader(x, ..., batch_size = 32)
## S3 method for class 'list'
as_dataloader(x, ...)
## S3 method for class 'dataloader'
as_dataloader(x, ...)
## S3 method for class 'matrix'
as_dataloader(x, ...)
## S3 method for class 'numeric'
as_dataloader(x, ...)
## S3 method for class 'array'
as_dataloader(x, ...)
## S3 method for class 'torch_tensor'
as_dataloader(x, ...)
```

Arguments

```
x the input object.
... Passed to torch::dataloader().
batch_size (int, optional): how many samples per batch to load (default: 1).
```

Details

as_dataloader methods should have sensible defaults for batch_size, parallel workers, etc.

It allows users to quickly experiment with fit.luz_module_generator() by not requiring to create a torch::dataset and a torch::dataloader in simple experiments.

Methods (by class)

- dataset: Converts a torch::dataset() to a torch::dataloader().
- list: Converts a list of tensors or arrays with the same size in the first dimension to a torch::dataloader()
- dataloader: Returns the same dataloader
- matrix: Converts the matrix to a dataloader
- numeric: Converts the numeric vector to a dataloader
- array: Converts the array to a dataloader
- torch_tensor: Converts the tensor to a dataloader

Overriding

You can implement your own as_dataloader S3 method if you want your data structure to be automatically supported by luz's fit.luz_module_generator(). The method must satisfy the following conditions:

- The method should return a torch::dataloader().
- The only required argument is x. You have good default for all other arguments.

It's better to avoid implementing as_dataloader methods for common S3 classes like data. frames. In this case, its better to assign a different class to the inputs and implement as_dataloader for it.

context	Context object	

Description

Context object storing information about the model training context. See also ctx.

Public fields

buffers This is a list of buffers that callbacks can use to write temporary information into ctx.

Active bindings

```
records stores information about values logged with self$log.
device allows querying the current accelerator device
callbacks list of callbacks that will be called.
iter current iteration
batch the current batch data. a list with input data and targets.
input a shortcut for ctx$batch[[1]]
target a shortcut for ctx$batch[[2]]
min_epochs the minimum number of epochs that the model will run on.
max_epochs the maximum number of epochs that the model will run.
hparams a list of hyperparameters that were used to initialize ctx$model.
opt_hparams a list of hyperparameters used to initialize the ctx$optimizers.
train_data a dataloader that is used for training the model
valid_data a dataloader using during model validation
accelerator an accelerator() used to move data, model and etc the the correct device.
optimizers a named list of optimizers that will be used during model training.
verbose bool wether the process is in verbose mode or not.
handlers List of error handlers that can be used. See rlang::with_handlers() for more info.
training A bool indicating if the model is in training or validation mode.
model The model being trained.
pred Last predicted values.
opt Current optimizer.
opt_name Current optimizer name.
data Current dataloader in use.
loss Last computed loss values. Detached from the graph.
loss_grad Last computed loss value, not detached, so you can do additional tranformation.
epoch Current epoch.
metrics List of metrics that are tracked by the process.
```

Methods

Public methods:

- context\$new()
- context\$log()
- context\$log_metric()
- context\$get_log()
- context\$get_metrics()
- context\$get_metric()
- context\$get_formatted_metrics()

```
context$get_metrics_df()
  • context$set_verbose()
  • context$clean()
  • context$call_callbacks()
  context$state_dict()
  • context$clone()
Method new(): Initializes the context object with minimal necessary information.
 Usage:
 context$new(verbose, accelerator, callbacks, training)
 Arguments:
 verbose Whether the context should be in verbose mode or not.
 accelerator A luz accelerator() that configures device placement and others.
 callbacks A list of callbacks used by the model. See luz_callback().
 training A boolean that indicates if the context is in training mode or not.
Method log(): Allows logging arbitrary information in the ctx.
 Usage:
 context$log(what, set, value, index = NULL, append = TRUE)
 Arguments:
 what (string) What you are logging.
 set (string) Usually 'train' or 'valid' indicating the set you want to lot to. But can be arbitrary
     info.
 value value to log
 value Arbitrary value to log.
 index Index that this value should be logged. If NULL the value is added to the end of list,
     otherwise the index is used.
 append If TRUE and a value in the corresponding index already exists, then value is appended
     to the current value. If FALSE value is overwritten in favor of the new value.
Method log_metric(): Log a metric gen its name and value. Metric values are indexed by
epoch.
 Usage:
 context$log_metric(name, value)
 Arguments:
 name name of the metric
 value value to log
 value Arbitrary value to log.
Method get_log(): Get a specific value from the log.
 context$get_log(what, set, index = NULL)
 Arguments:
```

```
what (string) What you are logging.
 set (string) Usually 'train' or 'valid' indicating the set you want to lot to. But can be arbitrary
     info.
 index Index that this value should be logged. If NULL the value is added to the end of list,
     otherwise the index is used.
Method get_metrics(): Get all metric given an epoch and set.
 Usage:
 context$get_metrics(set, epoch = NULL)
 Arguments:
 set (string) Usually 'train' or 'valid' indicating the set you want to lot to. But can be arbitrary
 epoch The epoch you want to extract metrics from.
Method get_metric(): Get the value of a metric given its name, epoch and set.
 Usage:
 context$get_metric(name, set, epoch = NULL)
 Arguments:
 name name of the metric
 set (string) Usually 'train' or 'valid' indicating the set you want to lot to. But can be arbitrary
 epoch The epoch you want to extract metrics from.
Method get_formatted_metrics(): Get formatted metrics values
 Usage:
 context$get_formatted_metrics(set, epoch = NULL)
 Arguments:
 set (string) Usually 'train' or 'valid' indicating the set you want to lot to. But can be arbitrary
     info.
 epoch The epoch you want to extract metrics from.
Method get_metrics_df(): Get a data.frame containing all metrics.
 Usage:
 context$get_metrics_df()
Method set_verbose(): Allows setting the verbose attribute.
 context$set_verbose(verbose = NULL)
 Arguments:
 verbose boolean. If TRUE verbose mode is used. If FALSE non verbose. if NULL we use the
     result of interactive().
Method clean(): Removes unnecessary information from the context object.
 Usage:
```

8 ctx

```
context$clean()
```

Method call_callbacks(): Call the selected callbacks. Where name is the callback types to call, eg 'on_epoch_begin'.

Usage:

context\$call_callbacks(name)

Arguments:

name name of the metric

Method state_dict(): Returns a list containing minimal information from the context. Used to create the returned values.

Usage:

context\$state_dict()

Method clone(): The objects of this class are cloneable with this method.

Usage:

context\$clone(deep = FALSE)

Arguments:

deep Whether to make a deep clone.

ctx

Context object

Description

Context objects used in luz to share information between model methods, metrics and callbacks.

Details

The ctx object is used in luz to share information between the training loop and callbacks, model methods and metrics. The table below describes information available in the ctx by default. Other callbacks could potentially modify these attributes or add new ones.

Attribute	Description
verbose	The value (TRUE or FALSE) attributed to the verbose argument in fit.
accelerator	Accelerator object used to query the correct device to place models, data, and etc. It assumes the value par
model	Initialized nn_module object that will be trained during the fit procedure.
optimizers	A named list of optimizers used during training.
data	Current in use dataloader. When training it's ctx\$train_data, when doing validation its ctx\$valid_dat
train_data	Dataloader passed to the data argument in fit. Modified to yield data in the selected device.
valid_data	Dataloader passed to the valid_data argument in fit. Modified to yield data in the selected device.
min_epochs	Minimum number of epochs the model will be trained for.

max_epochs | Maximum number of epochs the model will be trained for.

epoch Current training epoch.

iter Current training iteration. It's reset every epoch and when going from training to validation.

evaluate 9

Closure that will be used to do one step of the model. It's used for both training and validation. Takes no step Call callbacks by name. For example call_callbacks("on_train_begin") will call all callbacks that p call_callbacks batch Last batch obtained by the dataloader. A batch is a list() with 2 elements, one that is used as input and input First element of the last batch obtained by the current dataloader. Second element of the last batch obtained by the current dataloader. target pred Last predictions obtained by ctx\$model\$forward. Note: can be potentially modified by previously ran of Last computed loss from the model. Note: this might not be available if you modified the training or valid loss opt Current optimizer, ie. optimizer that will be used to do the next step to update parameters. Current optimizer name. By default it's opt, but can change if your model uses more than one optimizer opt_nm list() with current metric object that are updated at every on_train_batch_end() or on_valid_batcl metrics

Whether the model is in training or validation mode. See also help("luz_callback_train_valid")

List of callbacks that will be called during the training procedure. It's the union of the list passed to the ca

list() recording metric values for training and validation for each epoch. See also help("luz_callbackgrounds) recording metric values for training and validation for each epoch.

A named list() of handlers that is passed to rlang::with_handlers() during the training loop and car

Context attributes

See Also

records

handlers

training

callbacks

Context object: context

evaluate

Evaluates a fitted model on a dataset

Description

Evaluates a fitted model on a dataset

Usage

```
evaluate(
  object,
  data,
    ...,
  callbacks = list(),
  accelerator = NULL,
  verbose = NULL,
  dataloader_options = NULL)
```

Arguments

object A fitted model to evaluate.

10 evaluate

data (dataloader, dataset or list) A dataloader created with torch::dataloader()

used for training the model, or a dataset created with torch::dataset() or a list. Dataloaders and datasets must return list with at most 2 items. The first item will be used as input for the module and the second will be used as target

for the loss function.

... Currently unused.

callbacks (list, optional) A list of callbacks defined with luz_callback() that will be

called during the training procedure. The callbacks luz_callback_metrics(), luz_callback_progress() and luz_callback_train_valid() are always added

by default.

accelerator (accelerator, optional) An optional accelerator() object used to configure de-

vice placement of the components like nn_modules, optimizers and batches of

data.

verbose (logical, optional) An optional boolean value indicating if the fitting procedure

should emmit output to the console during training. By default, it will produce

output if interactive() is TRUE, otherwise it won't print to the console.

dataloader_options

Options used when creating a dataloader. See torch::dataloader(). shuffle=TRUE by default for the training data and batch_size=32 by default. It will error if

not NULL and data is already a dataloader.

evaluation <- fitted %>% evaluate(data = valid_dl)

Details

Once a model has been trained you might want to evaluate its performance in a different dataset. For that reason, luz provides the ?evaluate function that takes a fitted model and a dataset and computes the metrics attached to the model.

Evaluate returns a luz_module_evaluation object that you can query for metrics using the get_metrics function or simply print to see the results.

For example:

mse: 1.5159 ## rmse: 1.2312

See Also

Other training: fit.luz_module_generator(), predict.luz_module_fitted(), setup()

```
fit.luz_module_generator
```

Fit a nn module

Description

Fit a nn_module

Usage

```
## S3 method for class 'luz_module_generator'
fit(
  object,
  data,
  epochs = 10,
  callbacks = NULL,
  valid_data = NULL,
  accelerator = NULL,
  verbose = NULL,
  ...,
  dataloader_options = NULL
)
```

Arguments

object An nn_module that has been setup().

data (dataloader, dataset or list) A dataloader created with torch::dataloader()

used for training the model, or a dataset created with torch::dataset() or a list. Dataloaders and datasets must return list with at most 2 items. The first item will be used as input for the module and the second will be used as target

for the loss function.

epochs (int) The maximum number of epochs for training the model. If a single value

is provided, this is taken to be the max_epochs and min_epochs is set to 0. If a vector of two numbers is provided, the first value is min_epochs and the second value is max_epochs. The minimum and maximum number of epochs are included in the context object as ctx\$min_epochs and ctx\$max_epochs,

respectively.

callbacks (list, optional) A list of callbacks defined with luz_callback() that will be

called during the training procedure. The callbacks luz_callback_metrics(), luz_callback_progress() and luz_callback_train_valid() are always added

by default.

valid_data (dataloader, dataset, list or scalar value; optional) A dataloader created with

torch::dataloader() or a dataset created with torch::dataset() that will be used during the validation procedure. They must return a list with (input, target). If data is a torch dataset or a list, then you can also supply a numeric value between 0 and 1 - and in this case a random sample with size orresponding

to that proportion from data will be used for validation.

12 get_metrics

accelerator (accelerator, optional) An optional accelerator() object used to configure de-

vice placement of the components like nn_modules, optimizers and batches of

data.

verbose (logical, optional) An optional boolean value indicating if the fitting procedure

should emmit output to the console during training. By default, it will produce

output if interactive() is TRUE, otherwise it won't print to the console.

... Currently unused.

dataloader_options

Options used when creating a dataloader. See torch::dataloader(). shuffle=TRUE by default for the training data and batch_size=32 by default. It will error if

not NULL and data is already a dataloader.

Value

A fitted object that can be saved with luz_save() and can be printed with print() and plotted with plot().

See Also

predict.luz_module_fitted() for how to create predictions. setup() to find out how to create
modules that can be trained with fit.

Other training: evaluate(), predict.luz_module_fitted(), setup()

get_metrics

Get metrics from the object

Description

Get metrics from the object

Usage

```
get_metrics(object, ...)
## S3 method for class 'luz_module_fitted'
get_metrics(object, ...)
```

Arguments

object The object to query for metrics.

... Currently unused.

Value

A data frame containing the metric values.

lr_finder

Methods (by class)

• luz_module_fitted: Extract metrics from a luz fitted model.

lr_finder Learning Rate Finder

Description

Learning Rate Finder

Usage

```
lr_finder(object, data, steps = 100, start_lr = 1e-07, end_lr = 0.1, ...)
```

Arguments

object	An nn_module that has been setup().
data	(dataloader) A dataloader created with torch::dataloader() used for learning rate finding.
steps	(integer) The number of steps to iterate over in the learning rate finder. Default: 100.
start_lr	(float) The smallest learning rate. Default: 1e-7.
end_lr	(float) The highest learning rate. Default: 1e-1.
	Other arguments passed to fit.

Value

A dataframe with two columns: learning rate and loss

Examples

```
if (torch::torch_is_installed()) {
  library(torch)
  ds <- torch::tensor_dataset(x = torch_randn(100, 10), y = torch_randn(100, 1))
  dl <- torch::dataloader(ds, batch_size = 32)
  model <- torch::nn_linear
  model <- model %>% setup(
    loss = torch::nn_mse_loss(),
    optimizer = torch::optim_adam
) %>%
    set_hparams(in_features = 10, out_features = 1)
  records <- lr_finder(model, dl, verbose = FALSE)
  plot(records)
}</pre>
```

14 luz_callback

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Create a new callback

Description

Create a new callback

Usage

```
luz_callback(
  name = NULL,
  ...,
  private = NULL,
  active = NULL,
  parent_env = parent.frame(),
  inherit = NULL
)
```

Arguments

name	name of the callback
• • •	Public methods of the callback. The name of the methods is used to know how they should be called. See the details section.
private	An optional list of private members, which can be functions and non-functions.
active	An optional list of active binding functions.
parent_env	An environment to use as the parent of newly-created objects.
inherit	A R6ClassGenerator object to inherit from; in other words, a superclass. This is captured as an unevaluated expression which is evaluated in parent_env each time an object is instantiated.

Details

Let's implement a callback that prints 'Iteration n' (where n is the iteration number) for every batch in the training set and 'Done' when an epoch is finished. For that task we use the luz_callback function:

```
print_callback <- luz_callback(
  name = "print_callback",
  initialize = function(message) {
    self$message <- message
  },
  on_train_batch_end = function() {
    cat("Iteration ", ctx$iter, "\n")
  },
  on_epoch_end = function() {
    cat(self$message, "\n")</pre>
```

luz_callback 15

```
)
```

luz_callback() takes a named list of function as argument where the name indicate the moment at which the callback should be called. For instance on_train_batch_end() is called for every batch at the end of the training procedure and on_epoch() end is called at the end of every epoch.

The returned value of luz_callback() is a function that initializes an instance of the callback. Callbacks can have initialization parameters, like the name of a file you want to log the results, in this case, you can pass an initialize method when creating the callback definition and save these parameters to the self object. In the above example, the callback has a message parameter that is printed at the end of each epoch.

Once a callback is defined it can be passed to the fit function via the callbacks parameter, eg:

```
fitted <- net %>%
  setup(...) %>%
  fit(..., callbacks = list(
    print_callback(message = "Done!")
))
```

Callbacks can be called in many different positions of the training loop, including a combinations of them. Here's an overview of possible callback *breakpoints*:

```
Start Fit
   - on_fit_begin
  Start Epoch Loop
     - on_epoch_begin
   Start Train
       - on_train_begin
     Start Batch Loop
         - on_train_batch_begin
          Start Default Training Step
            - on_train_batch_after_pred
            - on_train_batch_after_loss
            - on_train_batch_before_backward
            - on_train_batch_before_step
            - on_train_batch_after_step
          End Default Training Step:
         - on_train_batch_end
     End Batch Loop
       - on_train_end
   End Train
   Start Valid
       on_valid_begin
     Start Batch Loop
         - on_valid_batch_begin
         Start Default Validation Step
            - on_valid_batch_after_pred
            - on_valid_batch_after_loss
```

```
End Default Validation Step
- on_valid_batch_end
End Batch Loop
- on_valid_end
End Valid
- on_epoch_end
End Epoch Loop
- on_fit_end
End Fit
```

Every step market with a on_* is a point in the training procedure that is available for callbacks to be called.

The other important part of callbacks is the ctx (context) object. See help("ctx") for details.

By default, callbacks are called in the same order as they were passed to fit (predict or evaluate) but you can provide a weight attribute that will control the order that it will be called. For example if a callback has weight = 10 and the other has weight = 1 then the first one is called after the second one. Callbacks that don't specify a weight attribute are considered weight = 0. A few buillt-in callbacks in luz already provide a weith value, for example the ?luz_early_stopping_callback, since in general we want to run it as the last thing in the loop.

Value

A luz_callback that can be passed to fit.luz_module_generator().

See Also

```
Other luz_callbacks: luz_callback_csv_logger(), luz_callback_early_stopping(), luz_callback_interrupt(), luz_callback_lr_scheduler(), luz_callback_metrics(), luz_callback_model_checkpoint(), luz_callback_profile(), luz_callback_progress(), luz_callback_train_valid()
```

Examples

```
print_callback <- luz_callback(
  name = "print_callback",
  on_train_batch_end = function() {
    cat("Iteration ", ctx$iter, "\n")
  },
  on_epoch_end = function() {
    cat("Done!\n")
  }
)</pre>
```

```
luz_callback_csv_logger
```

CSV logger callback

Description

Logs metrics obtained during training a fiel on disk. The file will have 1 line for each epoch/validation.

Usage

```
luz_callback_csv_logger(path)
```

Arguments

path

path to a file on disk.

See Also

Other luz_callbacks: luz_callback_early_stopping(), luz_callback_interrupt(), luz_callback_lr_scheduler(), luz_callback_metrics(), luz_callback_model_checkpoint(), luz_callback_profile(), luz_callback_progress luz_callback_train_valid(), luz_callback()

```
luz_callback_early_stopping
                        Early stopping callback
```

Description

Stops training when a monitored metric stops improving

Usage

```
luz_callback_early_stopping(
 monitor = "valid_loss",
 min_delta = 0,
 patience = 0,
 mode = "min",
 baseline = NULL
)
```

Arguments

monitor	A string in the format <set>_<metric> where <set> can be 'train' or 'valid' and</set></metric></set>
	<metric> can be the abbreviation of any metric that you are tracking during</metric>

training. The metric name is case insensitive.

min_delta Minimum improvement to reset the patience counter.

patience Number of epochs without improving until stoping training.

mode Specifies the direction that is considered an improvement. By default 'min' is

used. Can also be 'max' (higher is better) and 'zero' (closer to zero is better).

baseline An initial value that will be used as the best seen value in the begining. Model

will stopm training if no better than baseline value is found in the first patience

epochs.

Value

A luz_callback that does early stopping.

Note

This callback adds a on_early_stopping callback that can be used to call callbacks as soon as the model stops training.

If verbose=TRUE in fit.luz_module_generator() a message is printed when early stopping.

See Also

```
Other luz_callbacks: luz_callback_csv_logger(), luz_callback_interrupt(), luz_callback_lr_scheduler(), luz_callback_metrics(), luz_callback_model_checkpoint(), luz_callback_profile(), luz_callback_progress luz_callback_train_valid(), luz_callback()
```

Examples

```
cb <- luz_callback_early_stopping()</pre>
```

luz_callback_interrupt

Interrupt callback

Description

Adds a handler that allows interrupting the training loop using ctrl + C. Also registers a on_interrupt breakpoint so users can register callbacks to be run on training loop interruption.

Usage

```
luz_callback_interrupt()
```

Value

A luz_callback

Note

In general you don't need to use these callback by yourself because it's always included by default in fit.luz_module_generator().

See Also

```
Other luz_callbacks: luz_callback_csv_logger(), luz_callback_early_stopping(), luz_callback_lr_scheduler() luz_callback_metrics(), luz_callback_model_checkpoint(), luz_callback_profile(), luz_callback_progress luz_callback_train_valid(), luz_callback()
```

Examples

```
interrupt_callback <- luz_callback_interrupt()</pre>
```

```
luz_callback_lr_scheduler
```

Learning rate scheduler callback

Description

Initializes and runs torch::lr_scheduler()s.

Usage

```
luz_callback_lr_scheduler(
    lr_scheduler,
    ...,
    call_on = "on_epoch_end",
    opt_name = NULL
)
```

Arguments

Value

A luz_callback() generator.

See Also

```
Other luz_callbacks: luz_callback_csv_logger(), luz_callback_early_stopping(), luz_callback_interrupt(), luz_callback_metrics(), luz_callback_model_checkpoint(), luz_callback_profile(), luz_callback_progress luz_callback_train_valid(), luz_callback()
```

Examples

```
if (torch::torch_is_installed()) {
cb <- luz_callback_lr_scheduler(torch::lr_step, step_size = 30)
}</pre>
```

Description

Tracks metrics passed to setup() during training and validation.

Usage

luz_callback_metrics()

Details

This callback takes care of 2 ctx attributes:

- ctx\$metrics: stores the current metrics objects that are initialized once for epoch, and are further update()d and compute()d every batch. You will rarely need to work with these metrics.
- ctx\$records\$metrics: Stores metrics per training/validation and epoch. The structure is very similar to ctx\$losses.

Value

A luz_callback

Note

In general you won't need to explicitly use the metrics callback as it's used by default in fit.luz_module_generator().

See Also

```
Other luz_callbacks: luz_callback_csv_logger(), luz_callback_early_stopping(), luz_callback_interrupt(), luz_callback_lr_scheduler(), luz_callback_model_checkpoint(), luz_callback_profile(), luz_callback_progress(), luz_callback_train_valid(), luz_callback()
```

Description

This saves checkpoints of the model according to the specified metric and behavior.

Usage

```
luz_callback_model_checkpoint(
  path,
  monitor = "valid_loss",
  save_best_only = FALSE,
  mode = "min",
  min_delta = 0
)
```

Arguments

path Path to save the model on disk. The path is interpolated with glue, so you

can use any attribute within the ctx by using '{ctx\$epoch}'. Specially the epoch and monitor quantities are already in the environment. If the specified path is a path to a directory (ends with / or \), then models are saved with the name given by epoch-{epoch:02d}-{self\$monitor}-{monitor:.3f}.pt. See more in the examples. You can use sprintf() to quickly format quantities, for ex-

ample: '{epoch: 02d}'.

monitor A string in the format <set>_<metric> where <set> can be 'train' or 'valid' and

<metric> can be the abbreviation of any metric that you are tracking during

training. The metric name is case insensitive.

save_best_only if TRUE models are only saved if they have an improvement over a previously

saved model.

mode Specifies the direction that is considered an improvement. By default 'min' is

used. Can also be 'max' (higher is better) and 'zero' (closer to zero is better).

min_delta Minimum difference to consider as improvement. Only used when save_best_only=TRUE.

Note

mode and min_delta are only used when save_best_only=TRUE. save_best_only will overwrite the saved models if the path parameter don't differentiate by epochs.

See Also

```
Other luz_callbacks: luz_callback_csv_logger(), luz_callback_early_stopping(), luz_callback_interrupt(), luz_callback_lr_scheduler(), luz_callback_metrics(), luz_callback_profile(), luz_callback_progress(), luz_callback_train_valid(), luz_callback()
```

Examples

```
luz_callback_model_checkpoint(path= "path/to/dir")
luz_callback_model_checkpoint(path= "path/to/dir/epoch-{epoch:02d}/model.pt")
luz_callback_model_checkpoint(path= "path/to/dir/epoch-{epoch:02d}/model-{monitor:.2f}.pt")
```

22 luz_callback_profile

```
luz_callback_profile Profile callback
```

Description

Computes the times for high-level operations in the training loops.

Usage

```
luz_callback_profile()
```

Details

Records are saved in ctx\$records\$profile. Times are stored as seconds. Data is stored in the following structure:

- **fit** time for the entire fit procedure.
- epoch times per epoch
- (train/valid)_batch time per batch of data processed, including data acquisition and step.
- (train/valid)_step time per step (training or validation step) only the model step. (not including data acquisition and preprocessing)

Value

```
A luz_callback
```

Note

In general you don't need to use these callback by yourself because it's always included by default in fit.luz_module_generator().

See Also

```
Other luz_callbacks: luz_callback_csv_logger(), luz_callback_early_stopping(), luz_callback_interrupt(), luz_callback_lr_scheduler(), luz_callback_metrics(), luz_callback_model_checkpoint(), luz_callback_progress(), luz_callback_train_valid(), luz_callback()
```

Examples

```
profile_callback <- luz_callback_profile()</pre>
```

luz_callback_progress 23

luz_callback_progress Progress callback

Description

Responsible for printing progress during training.

Usage

```
luz_callback_progress()
```

Value

A luz_callback

Note

In general you don't need to use these callback by yourself because it's always included by default in fit.luz_module_generator().

Printing can be disabled by passing verbose=FALSE to fit.luz_module_generator().

See Also

```
Other luz_callbacks: luz_callback_csv_logger(), luz_callback_early_stopping(), luz_callback_interrupt(), luz_callback_lr_scheduler(), luz_callback_metrics(), luz_callback_model_checkpoint(), luz_callback_profile(), luz_callback_train_valid(), luz_callback()
```

```
luz_callback_train_valid
```

Train-eval callback

Description

Switches important flags for training and evaluation modes.

Usage

```
luz_callback_train_valid()
```

Details

It takes care of the three ctx attributes:

- ctx\$model: Responsible for calling ctx\$model\$train() and ctx\$model\$eval(), when appropriate.
- ctx\$training: Sets this flag to TRUE when training and FALSE when in validation mode.
- ctx\$loss: Resets the loss attribute to list() when finished training/ or validating.

Value

A luz_callback

Note

In general you won't need to explicitly use the metrics callback as it's used by default in fit.luz_module_generator().

See Also

```
Other luz_callbacks: luz_callback_csv_logger(), luz_callback_early_stopping(), luz_callback_interrupt(), luz_callback_lr_scheduler(), luz_callback_metrics(), luz_callback_model_checkpoint(), luz_callback_profile(), luz_callback_progress(), luz_callback()
```

luz_load

Load trained model

Description

Loads a fitted model. See documentation in luz_save().

Usage

```
luz_load(path)
```

Arguments

path

path in file system so save the object.

See Also

```
Other luz_save: luz_save()
```

luz_load_model_weights

Loads model weights into a fitted object.

Description

This can be useful when you have saved model checkpoints during training and want to reload the best checkpoint in the end.

Usage

```
luz_load_model_weights(obj, path, ...)
luz_save_model_weights(obj, path)
```

luz_metric 25

Arguments

obj	luz object to which you want to copy the new weights.
path	path to saved model in disk.
	other arguments passed to torch_load().

Value

Returns NULL invisibly.

Warning

luz_save_model_weights operates inplace, ie modifies the model object to contain the new weights.

luz_metric Creates a new luz metric

Description

Creates a new luz metric

Usage

```
luz_metric(
  name = NULL,
  ...,
  private = NULL,
  active = NULL,
  parent_env = parent.frame(),
  inherit = NULL
)
```

Arguments

name	string naming the new metric.		
	named list of public methods. You should implement at least initialize, update and compute. See the details section for more information.		
private	ivate An optional list of private members, which can be functions and non-functions		
active	An optional list of active binding functions.		
parent_env	An environment to use as the parent of newly-created objects.		
inherit A R6ClassGenerator object to inherit from; in other words, a superclass. captured as an unevaluated expression which is evaluated in parent_en time an object is instantiated.			

26 luz_metric

Details

In order to implement a new luz_metric we need to implement 3 methods:

• initialize: defines the metric initial state. This function is called for each epoch for both training and validation loops.

- update: updates the metric internal state. This function is called at every training and validation step with the predictions obtained by the model and the target values obtained from the dataloader.
- compute: uses the internal state to compute metric values. This function is called whenever we need to obtain the current metric value. Eg, it's called every training step for metrics displayed in the progress bar, but only called once per epoch to record it's value when the progress bar is not displayed.

Optionally, you can implement a abbrev field that gives the metric an abbreviation that will be used when displaying metric information in the console or tracking record. If no abbrev is passed, the class name will be used.

Let's take a look at the implementation of luz_metric_accuracy so you can see how to implement a new one:

```
luz_metric_accuracy <- luz_metric(</pre>
  # An abbreviation to be shown in progress bars, or
  # when printing progress
  abbrev = "Acc",
  # Initial setup for the metric. Metrics are initialized
  # every epoch, for both training and validation
  initialize = function() {
    self$correct <- 0
    self$total <- 0
  },
  # Run at every training or validation step and updates
  # the internal state. The update function takes `preds`
  # and `target` as parameters.
  update = function(preds, target) {
    pred <- torch::torch_argmax(preds, dim = 2)</pre>
    self$correct <- self$correct + (pred == target)$</pre>
      to(dtype = torch::torch_float())$
      sum()$
      item()
    self$total <- self$total + pred$numel()</pre>
  # Use the internal state to query the metric value
  compute = function() {
    self$correct/self$total
  }
)
```

Note: It's good practice that the compute metric returns regular R values instead of torch tensors and other parts of luz will expect that.

luz_metric_accuracy 27

Value

Returns new Luz metric.

See Also

```
Other luz_metrics: luz_metric_accuracy(), luz_metric_binary_accuracy_with_logits(), luz_metric_binary_accuracy(), luz_metric_binary_auroc(), luz_metric_mae(), luz_metric_mse(), luz_metric_mse()
```

Examples

```
luz_metric_accuracy <- luz_metric(</pre>
 # An abbreviation to be shown in progress bars, or
 # when printing progress
 abbrev = "Acc",
 # Initial setup for the metric. Metrics are initialized
 # every epoch, for both training and validation
 initialize = function() {
   self$correct <- 0
   self$total <- 0
 # Run at every training or validation step and updates
 # the internal state. The update function takes `preds`
 # and `target` as parameters.
 update = function(preds, target) {
    pred <- torch::torch_argmax(preds, dim = 2)</pre>
    self$correct <- self$correct + (pred == target)$</pre>
      to(dtype = torch::torch_float())$
      sum()$
      item()
   self$total <- self$total + pred$numel()</pre>
 },
 # Use the internal state to query the metric value
 compute = function() {
    self$correct/self$total
)
```

luz_metric_accuracy Accuracy

Description

Computes accuracy for multi-class classification problems.

Usage

```
luz_metric_accuracy()
```

Details

This metric expects to take logits or probabilities at every update. It will then take the columnwise argmax and compare to the target.

Value

Returns new Luz metric.

See Also

```
Other luz_metrics: luz_metric_binary_accuracy_with_logits(), luz_metric_binary_accuracy(), luz_metric_binary_auroc(), luz_metric_mae(), luz_metric_mse(), luz_metric_multiclass_auroc(), luz_metric_rmse(), luz_metric()
```

Examples

```
if (torch::torch_is_installed()) {
  library(torch)
  metric <- luz_metric_accuracy()
  metric <- metric$new()
  metric$update(torch_randn(100, 10), torch::torch_randint(1, 10, size = 100))
  metric$compute()
}</pre>
```

Description

Computes the accuracy for binary classification problems where the model returns probabilities. Commonly used when the loss is torch::nn_bce_loss().

Usage

```
luz_metric_binary_accuracy(threshold = 0.5)
```

Arguments

threshold value used to classifiy observations between 0 and 1.

Value

Returns new Luz metric.

See Also

```
Other luz_metrics: luz_metric_accuracy(), luz_metric_binary_accuracy_with_logits(), luz_metric_binary_auroc(), luz_metric_mae(), luz_metric_mse(), luz_metric_multiclass_auroc(), luz_metric_rmse(), luz_metric()
```

Examples

```
if (torch::torch_is_installed()) {
  library(torch)
  metric <- luz_metric_binary_accuracy(threshold = 0.5)
  metric <- metric$new()
  metric$update(torch_rand(100), torch::torch_randint(0, 1, size = 100))
  metric$compute()
}</pre>
```

Description

Computes accuracy for binary classification problems where the model return logits. Commonly used together with torch::nn_bce_with_logits_loss().

Usage

```
luz_metric_binary_accuracy_with_logits(threshold = 0.5)
```

Arguments

threshold value used to classifiy observations between 0 and 1.

Details

Probabilities are generated using torch::nnf_sigmoid() and threshold is used to classify between 0 or 1.

Value

Returns new Luz metric.

See Also

```
Other luz_metrics: luz_metric_accuracy(), luz_metric_binary_accuracy(), luz_metric_binary_auroc(), luz_metric_mae(), luz_metric_mse(), luz_metric_multiclass_auroc(), luz_metric_rmse(), luz_metric()
```

Examples

```
if (torch::torch_is_installed()) {
  library(torch)
metric <- luz_metric_binary_accuracy_with_logits(threshold = 0.5)
metric <- metric$new()
metric$update(torch_randn(100), torch::torch_randint(0, 1, size = 100))
metric$compute()
}</pre>
```

luz_metric_binary_auroc

Computes the area under the ROC

Description

To avoid storing all predictions and targets for an epoch we compute confusion matrices across a range of pre-established thresholds.

Usage

```
luz_metric_binary_auroc(
  num_thresholds = 200,
  thresholds = NULL,
  from_logits = FALSE
)
```

Arguments

num_thresholds Number of thresholds used to compute confusion matrices. In that case, thresholds are created by getting num_thresholds values linearly spaced in the unit interval.
 thresholds (optional) If threshold are passed, then those are used to compute the confusion matrices and num_thresholds is ignored.
 from_logits Boolean indicating if predictions are logits, in that case we use sigmoid to put them in the unit interval.

See Also

```
Other luz_metrics: luz_metric_accuracy(), luz_metric_binary_accuracy_with_logits(), luz_metric_binary_accuracy(), luz_metric_mae(), luz_metric_mse(), luz_metric_multiclass_auroc(), luz_metric_rmse(), luz_metric()
```

luz_metric_mae 31

Examples

```
if (torch::torch_is_installed()){
library(torch)
actual <- c(1, 1, 1, 0, 0, 0)
predicted <- c(0.9, 0.8, 0.4, 0.5, 0.3, 0.2)

y_true <- torch_tensor(actual)
y_pred <- torch_tensor(predicted)

m <- luz_metric_binary_auroc(thresholds = predicted)
m <- m$new()

m$update(y_pred[1:2], y_true[1:2])
m$update(y_pred[3:4], y_true[3:4])
m$update(y_pred[5:6], y_true[5:6])

m$compute()
}</pre>
```

luz_metric_mae

Mean absolute error

Description

Computes the mean absolute error.

Usage

```
luz_metric_mae()
```

Value

Returns new Luz metric.

See Also

```
Other luz_metrics: luz_metric_accuracy(), luz_metric_binary_accuracy_with_logits(), luz_metric_binary_accuracy(), luz_metric_binary_auroc(), luz_metric_mse(), luz_metric_multiclass_auroc luz_metric_rmse(), luz_metric()
```

Examples

```
if (torch::torch_is_installed()) {
library(torch)
metric <- luz_metric_mae()
metric <- metric$new()
metric$update(torch_randn(100), torch_randn(100))
metric$compute()
}</pre>
```

luz_metric_mse

Mean squared error

Description

Computes the mean squared error

Usage

```
luz_metric_mse()
```

Value

A luz_metric object.

See Also

```
Other luz_metrics: luz_metric_accuracy(), luz_metric_binary_accuracy_with_logits(), luz_metric_binary_accuracy(), luz_metric_binary_auroc(), luz_metric_mae(), luz_metric_multiclass_auroc luz_metric_rmse(), luz_metric()
```

```
luz_metric_multiclass_auroc
```

Computes the multi-class AUROC

Description

The same definition as Keras is used by default. This is equivalent to the 'micro' method in SciKit Learn too. See docs.

Usage

```
luz_metric_multiclass_auroc(
  num_thresholds = 200,
  thresholds = NULL,
  from_logits = FALSE,
  average = c("micro", "macro", "weighted", "none")
)
```

Arguments

num_thresholds Number of thresholds used to compute confusion matrices. In that case, thresh-

olds are created by getting num_thresholds values linearly spaced in the unit

interval.

thresholds (optional) If threshold are passed, then those are used to compute the confusion

matrices and num_thresholds is ignored.

from_logits If TRUE then we call torch::nnf_softmax() in the predictions before comput-

ing the metric.

average The averaging method:

• 'micro': Stack all classes and computes the AUROC as if it was a binary classification problem.

• 'macro': Finds the AUCROC for each class and computes their mean.

• 'weighted': Finds the AUROC for each class and computes their weighted mean pondering by the number of instances for each class.

• 'none': Returns the AUROC for each class in a list.

Details

Note that class imbalance can affect this metric unlike the AUC for binary classification.

Currently the AUC is approximated using the 'interpolation' method described in Keras.

See Also

```
Other luz_metrics: luz_metric_accuracy(), luz_metric_binary_accuracy_with_logits(), luz_metric_binary_accuracy(), luz_metric_binary_auroc(), luz_metric_mae(), luz_metric_mse(), luz_metric_rmse(), luz_metric()
```

Examples

luz_save

luz_metric_rmse	Root mean squared error
Tuz_iiie ti Tt_i iiise	Root mean squarea error

Description

Computes the root mean squared error.

Usage

```
luz_metric_rmse()
```

Value

Returns new Luz metric.

See Also

```
Other luz_metrics: luz_metric_accuracy(), luz_metric_binary_accuracy_with_logits(), luz_metric_binary_accuracy(), luz_metric_binary_auroc(), luz_metric_mae(), luz_metric_mse(), luz_metric_multiclass_auroc(), luz_metric()
```

luz_save

Saves luz objects to disk

Description

Allows saving luz fitted models to the disk. Objects can be loaded back with luz_load().

Usage

```
luz_save(obj, path, ...)
```

Arguments

```
obj an object of class 'luz_module_fitted' as returned by fit.luz_module_generator().

path path in file system so save the object.

currently unused.
```

Warning

The ctx is naively serialized. Ie, we only use saveRDS() to serialize it. Don't expect luz_save to work correctly if you have unserializable objects in the ctx like torch_tensors and external pointers in general.

Note

Objects are saved as plain .rds files but obj\$model is serialized with torch_save before saving it.

See Also

```
Other luz_save: luz_load()

predict.luz_module_fitted

Create predictions for a fitted model
```

Description

Create predictions for a fitted model

Usage

```
## S3 method for class 'luz_module_fitted'
predict(
  object,
  newdata,
  ...,
  callbacks = list(),
  accelerator = NULL,
  verbose = NULL,
  dataloader_options = NULL
)
```

Arguments

object	(fitted model) the fitted model object returned from fit.luz_module_generator()
newdata	(dataloader, dataset, list or array) returning a list with at least 1 element. The other elements aren't used.
	Currently unused.
callbacks	(list, optional) A list of callbacks defined with luz_callback() that will be called during the training procedure. The callbacks luz_callback_metrics(), luz_callback_progress() and luz_callback_train_valid() are always added by default.
accelerator	(accelerator, optional) An optional accelerator() object used to configure device placement of the components like nn_modules, optimizers and batches of data.
verbose	(logical, optional) An optional boolean value indicating if the fitting procedure should emmit output to the console during training. By default, it will produce output if interactive() is TRUE, otherwise it won't print to the console.

36 setup

```
dataloader_options
```

Options used when creating a dataloader. See torch::dataloader(). shuffle=TRUE by default for the training data and batch_size=32 by default. It will error if not NULL and data is already a dataloader.

See Also

Other training: evaluate(), fit.luz_module_generator(), setup()

setup	Set's up a nn_module to use with luz	
-------	--------------------------------------	--

Description

The setup function is used to set important attributes and method for nn_modules to be used with Luz.

Usage

```
setup(module, loss = NULL, optimizer = NULL, metrics = NULL)
```

Arguments

module	(nn_module) The nn_module that you want set up.
loss	(function, optional) An optional function with the signature function(input, target). It's only requires if your nn_module doesn't implement a method called loss.
optimizer	(torch_optimizer, optional) A function with the signature function(parameters,) that is used to initialize an optimizer given the model parameters.
metrics	(list, optional) A list of metrics to be tracked during the training procedure.

Details

It makes sure the module have all the necessary ingredients in order to be fitted.

Value

A luz module that can be trained with fit().

See Also

```
Other training: evaluate(), fit.luz_module_generator(), predict.luz_module_fitted()
```

set_hparams 37

set	hparams	

Set hyper-parameter of a module

Description

This function is used to define hyper-parameters before calling fit for luz_modules.

Usage

```
set_hparams(module, ...)
```

Arguments

module

An nn_module that has been setup().

. . .

The parameters set here will be used to initialize the nn_module, ie they are passed unchanged to the initialize method of the base nn_module.

Value

The same luz module

See Also

```
Other set_hparam: set_opt_hparams()
```

set_opt_hparams

Set optimizer hyper-parameters

Description

This function is used to define hyper-parameters for the optimizer initialization method.

Usage

```
set_opt_hparams(module, ...)
```

Arguments

module

An nn_module that has been setup().

. . .

The parameters passed here will be used to initialize the optimizers. For example, if your optimizer is optim_adam and you pass lr=0.1, then the optim_adam function is called with optim_adam(parameters, lr=0.1) when fitting the model.

Value

The same luz module

38 set_opt_hparams

See Also

Other set_hparam: set_hparams()

Index

* luz_callbacks	evaluate, 9, <i>12</i> , <i>36</i>
luz_callback, 14	
<pre>luz_callback_csv_logger, 16</pre>	fit(), <i>36</i>
<pre>luz_callback_early_stopping, 17</pre>	fit.luz_module_generator, 10, 11, 36
<pre>luz_callback_interrupt, 18</pre>	fit.luz_module_generator(), 3, 4, 16, 18,
<pre>luz_callback_lr_scheduler, 19</pre>	20, 22–24, 34, 35
<pre>luz_callback_metrics, 20</pre>	
<pre>luz_callback_model_checkpoint, 20</pre>	<pre>get_metrics, 12</pre>
luz_callback_profile, 22	
luz_callback_progress, 23	interactive(), 7, 10, 12, 35
<pre>luz_callback_train_valid, 23</pre>	
* luz_metrics	lr_finder, 13
luz_metric, 25	luz_callback, 14, <i>17–24</i>
luz_metric_accuracy, 27	luz_callback(), 6, 10, 11, 19, 35
luz_metric_binary_accuracy, 28	luz_callback_csv_logger, <i>16</i> , 16, <i>18</i> – <i>24</i>
<pre>luz_metric_binary_accuracy_with_logits,</pre>	<pre>luz_callback_early_stopping, 16, 17, 17,</pre>
29	18–24
<pre>luz_metric_binary_auroc, 30</pre>	luz_callback_interrupt, <i>16-18</i> , 18, <i>19-24</i>
luz_metric_mae, 31	<pre>luz_callback_lr_scheduler, 16-18, 19,</pre>
<pre>luz_metric_mse, 32</pre>	20–24
<pre>luz_metric_multiclass_auroc, 32</pre>	luz_callback_metrics, <i>16-19</i> , 20, <i>21-24</i>
<pre>luz_metric_rmse, 34</pre>	<pre>luz_callback_metrics(), 10, 11, 35</pre>
* luz_save	<pre>luz_callback_model_checkpoint, 16-20,</pre>
luz_load, 24	20, 22–24
luz_save, 34	luz_callback_profile, <i>16–21</i> , 22, 23, 24
* set_hparam	luz_callback_progress, 16-22, 23, 24
set_hparams, 37	<pre>luz_callback_progress(), 10, 11, 35</pre>
set_opt_hparams, 37	<pre>luz_callback_train_valid, 16-23, 23</pre>
* training	<pre>luz_callback_train_valid(), 10, 11, 35</pre>
evaluate, 9	luz_load, 24, <i>35</i>
<pre>fit.luz_module_generator, 11</pre>	luz_load(), <i>34</i>
<pre>predict.luz_module_fitted, 35</pre>	<pre>luz_load_model_weights, 24</pre>
setup, 36	luz_metric, 25, 28-34
	luz_metric_accuracy, 27, 27, 29-34
accelerator, 2	luz_metric_binary_accuracy, 27, 28, 28,
accelerator(), 5, 6, 10, 12, 35	29–34
as_dataloader,3	luz_metric_binary_accuracy_with_logits, 27-29, 29, 30-34
context, 4, 9	luz_metric_binary_auroc, 27–29, 30,
ctx, 4, 8, 20, 21, 34	31–34

40 INDEX

```
luz_metric_mae, 27-30, 31, 32-34
luz_metric_mse, 27-31, 32, 33, 34
luz_metric_multiclass_auroc, 27–32, 32,
        34
luz_metric_rmse, 27–33, 34
luz_save, 24, 34
luz_save(), 12, 24
luz_save_model_weights
        (luz_load_model_weights), 24
nn_module, 10, 12, 35
plot(), 12
predict.luz_module_fitted, 10, 12, 35, 36
predict.luz_module_fitted(), 12
print(), 12
rlang::with_handlers(), 5
saveRDS(), 34
set_hparams, 37, 38
set_opt_hparams, 37, 37
setup, 10, 12, 36, 36
setup(), 11, 12, 20, 37
sprintf(), 21
torch::dataloader, 3, 4
torch::dataloader(), 4, 10-12, 36
torch::dataset, 4
torch::dataset(), 4, 10, 11
torch::lr_scheduler(), 19
torch::nn_bce_loss(), 28
torch::nn_bce_with_logits_loss(), 29
torch::nnf_sigmoid(), 29
torch::nnf_softmax(), 33
torch_load(), 25
```