Package 'future.apply'

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future.apply

future.apply: Apply Function to Elements in Parallel using Futures

Description

The **future.apply** packages provides parallel implementations of common "apply" functions provided by base R. The parallel processing is performed via the **future** ecosystem, which provides a large number of parallel backends, e.g. on the local machine, a remote cluster, and a high-performance compute cluster.

Details

Currently implemented functions are:

```
• future_apply(): a parallel version of apply()
```

- future_by(): a parallel version of by()
- future_eapply(): a parallel version of eapply()
- future_lapply(): a parallel version of lapply()
- future_mapply(): a parallel version of mapply()
- future_sapply(): a parallel version of sapply()
- future_tapply(): a parallel version of tapply()
- future_vapply(): a parallel version of vapply()
- future_Map(): a parallel version of Map()
- future_replicate(): a parallel version of replicate()
- future_.mapply(): a parallel version of .mapply()

Reproducibility is part of the core design, which means that perfect, parallel random number generation (RNG) is supported regardless of the amount of chunking, type of load balancing, and future backend being used.

Since these future_*() functions have the same arguments as the corresponding base R function, start using them is often as simple as renaming the function in the code. For example, after attaching the package:

```
library(future.apply)

code such as:

x <- list(a = 1:10, beta = exp(-3:3), logic = c(TRUE,FALSE,TRUE))
y <- lapply(x, quantile, probs = 1:3/4)

can be updated to:

y <- future_lapply(x, quantile, probs = 1:3/4)</pre>
```

The default settings in the **future** framework is to process code *sequentially*. To run the above in parallel on the local machine (on any operating system), use:

```
plan(multisession)
```

first. That's it!

To go back to sequential processing, use plan(sequential). If you have access to multiple machines on your local network, use:

```
plan(cluster, workers = c("n1", "n2", "n2", "n3"))
```

This will set up four workers, one on n1 and n3, and two on n2. If you have SSH access to some remote machines, use:

```
plan(cluster, workers = c("m1.myserver.org", "m2.myserver.org))
```

See the **future** package and **future**::plan() for more examples.

The **future.batchtools** package provides support for high-performance compute (HPC) cluster schedulers such as SGE, Slurm, and TORQUE / PBS. For example,

- plan(batchtools_slurm): Process via a Slurm scheduler job queue.
- plan(batchtools_torque): Process via a TORQUE / PBS scheduler job queue.

This builds on top of the queuing framework that the **batchtools** package provides. For more details on backend configuration, please see the **future.batchtools** and **batchtools** packages.

These are just a few examples of parallel/distributed backend for the future ecosystem. For more alternatives, see the 'Reverse dependencies' section on the future CRAN package page.

Author(s)

Henrik Bengtsson, except for the implementations of future_apply(), future_Map(), future_replicate(), future_sapply(), and future_tapply(), which are adopted from the source code of the corresponding base R functions, which are licensed under GPL (>= 2) with 'The R Core Team' as the copyright holder. Because of these dependencies, the license of this package is GPL (>= 2).

future_apply

Apply Functions Over Array Margins via Futures

Description

future_apply() implements base::apply() using future with perfect replication of results, regardless of future backend used. It returns a vector or array or list of values obtained by applying a function to margins of an array or matrix.

Usage

```
future_apply(
    X,
    MARGIN,
    FUN,
    ...,
    simplify = TRUE,
    future.stdout = TRUE,
    future.conditions = NULL,
    future.globals = TRUE,
    future.packages = NULL,
    future.lazy = FALSE,
    future.seed = FALSE,
    future.scheduling = 1,
    future.chunk.size = NULL,
    future.label = "future_apply-%d"
)
```

Arguments

X an array, including a matrix.

MARGIN A vector giving the subscripts which the function will be applied over. For

example, for a matrix 1 indicates rows, 2 indicates columns, c(1,2) indicates rows and columns. Where X has named dimnames, it can be a character vector

selecting dimension names.

FUN A function taking at least one argument.

simplify a logical indicating whether results should be simplified if possible.

future.stdout If TRUE (default), then the standard output of the underlying futures is captured,

and re-outputted as soon as possible. If FALSE, any output is silenced (by sinking it to the null device as it is outputted). If NA (not recommended), output is not

intercepted.

future.conditions

A character string of conditions classes to be captured and relayed. The default is the same as the condition argument of future::Future(). To not intercept conditions, use conditions = character(0L). Errors are always relayed.

future.globals A logical, a character vector, or a named list for controlling how globals are

handled. For details, see below section.

future.packages

(optional) a character vector specifying packages to be attached in the R envi-

ronment evaluating the future.

future.lazy Specifies whether the futures should be resolved lazily or eagerly (default).

future.seed A logical or an integer (of length one or seven), or a list of length(X) with

pre-generated random seeds. For details, see below section.

future.scheduling

Average number of futures ("chunks") per worker. If 0.0, then a single future is used to process all elements of X. If 1.0 or TRUE, then one future per worker

is used. If 2.0, then each worker will process two futures (if there are enough elements in X). If Inf or FALSE, then one future per element of X is used. Only used if future.chunk.size is NULL.

future.chunk.size

The average number of elements per future ("chunk"). If Inf, then all elements are processed in a single future. If NULL, then argument future.scheduling is used.

future.label

If a character string, then each future is assigned a label sprintf(future.label,chunk_idx). If TRUE, then the same as future.label = "future_lapply-%d". If FALSE, no labels are assigned.

... (optional) Additional arguments passed to FUN(), except future.* arguments, which are passed on to future_lapply() used internally.

Value

Returns a vector or array or list of values obtained by applying a function to margins of an array or matrix. See base::apply() for details.

Author(s)

The implementations of future_apply() is adopted from the source code of the corresponding base R function, which is licensed under GPL (>= 2) with 'The R Core Team' as the copyright holder.

Examples

```
## -----
## apply()
## -----
X \leftarrow matrix(c(1:4, 1, 6:8), nrow = 2L)
Y0 \leftarrow apply(X, MARGIN = 1L, FUN = table)
Y1 <- future_apply(X, MARGIN = 1L, FUN = table)
print(Y1)
stopifnot(all.equal(Y1, Y0, check.attributes = FALSE)) ## FIXME
Y0 <- apply(X, MARGIN = 1L, FUN = stats::quantile)
Y1 <- future_apply(X, MARGIN = 1L, FUN = stats::quantile)
print(Y1)
stopifnot(all.equal(Y1, Y0))
## Parallel Random Number Generation
## -----
## Regardless of the future plan, the number of workers, and
## where they are, the random numbers produced are identical
X \leftarrow matrix(c(1:4, 1, 6:8), nrow = 2L)
```

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```
plan(multisession)
Y1 <- future_apply(X, MARGIN = 1L, FUN = sample, future.seed = 0xBEEF)
print(Y1)

plan(sequential)
Y2 <- future_apply(X, MARGIN = 1L, FUN = sample, future.seed = 0xBEEF)
print(Y2)

stopifnot(all.equal(Y1, Y2))</pre>
```

future_by

Apply a Function to a Data Frame Split by Factors via Futures

Description

Apply a Function to a Data Frame Split by Factors via Futures

Usage

```
future_by(data, INDICES, FUN, ..., simplify = TRUE)
```

Arguments

data An R object, normally a data frame, possibly a matrix.

INDICES A factor or a list of factors, each of length nrow(data).

FUN a function to be applied to (usually data-frame) subsets of data.

simplify logical: see base::tapply.

... Additional arguments pass to future_lapply() and then to FUN().

Details

Internally, data is grouped by INDICES into a list of data subset elements which is then processed by future_lapply(). When the groups differ significantly in size, the processing time may differ significantly between the groups. To correct for processing-time imbalances, adjust the amount of chunking via arguments future.scheduling and future.chunk.size.

Value

An object of class "by", giving the results for each subset. This is always a list if simplify is false, otherwise a list or array (see base::tapply). See also base::by() for details.

Note on 'stringsAsFactors'

The future_by() is modeled as closely as possible to the behavior of base::by(). Both functions have "default" S3 methods that calls data <-as.data.frame(data) internally. This call may in turn call an S3 method for as.data.frame() that coerces strings to factors or not depending on whether it has a stringsAsFactors argument and what its default is. For example, the S3 method of as.data.frame() for lists changed its (effective) default from stringsAsFactors = TRUE to stringsAsFactors = TRUE in R 4.0.0.

Examples

future_eapply

Apply a Function over a List or Vector via Futures

Description

future_lapply() implements base::lapply() using futures with perfect replication of results, regardless of future backend used. Analogously, this is true for all the other future_nnn() functions.

Usage

```
future_eapply(
  env,
  FUN,
  ...,
  all.names = FALSE,
  USE.NAMES = TRUE,
  future.label = "future_eapply-%d"
)
future_lapply(
```

```
Χ,
  FUN,
  future.stdout = TRUE,
  future.conditions = NULL,
  future.globals = TRUE,
  future.packages = NULL,
  future.lazy = FALSE,
  future.seed = FALSE,
  future.scheduling = 1,
  future.chunk.size = NULL,
  future.label = "future_lapply-%d"
)
future_replicate(
  n,
  expr,
  simplify = "array",
  future.seed = TRUE,
 future.label = "future_replicate-%d"
)
future_sapply(
 Χ,
  FUN.
  simplify = TRUE,
 USE.NAMES = TRUE,
  future.label = "future_sapply-%d"
)
future_tapply(
  Χ,
  INDEX,
  FUN = NULL,
 default = NA,
  simplify = TRUE,
  future.label = "future_tapply-%d"
)
future_vapply(
  Χ,
  FUN,
  FUN. VALUE,
 USE.NAMES = TRUE,
```

```
future.label = "future_vapply-%d"
)
```

Arguments

env An R environment.

FUN A function taking at least one argument.

all.names If TRUE, the function will also be applied to variables that start with a period (.),

otherwise not. See base::eapply() for details.

USE.NAMES See base::sapply().

future.label If a character string, then each future is assigned a label sprintf(future.label,chunk_idx).

If TRUE, then the same as future.label = "future_lapply-%d". If FALSE,

no labels are assigned.

X A vector-like object to iterate over.

future.stdout If TRUE (default), then the standard output of the underlying futures is captured,

and re-outputted as soon as possible. If FALSE, any output is silenced (by sinking it to the null device as it is outputted). If NA (not recommended), output is *not*

intercepted.

future.conditions

A character string of conditions classes to be captured and relayed. The default is the same as the condition argument of future::Future(). To not intercept conditions, use conditions = character(0L). Errors are always relayed.

future.globals A logical, a character vector, or a named list for controlling how globals are

handled. For details, see below section.

future.packages

(optional) a character vector specifying packages to be attached in the R envi-

ronment evaluating the future.

future.lazy Specifies whether the futures should be resolved lazily or eagerly (default).

future.seed A logical or an integer (of length one or seven), or a list of length(X) with

pre-generated random seeds. For details, see below section.

future.scheduling

Average number of futures ("chunks") per worker. If $\emptyset.\emptyset$, then a single future is used to process all elements of X. If 1.0 or TRUE, then one future per worker is used. If 2.0, then each worker will process two futures (if there are enough elements in X). If Inf or FALSE, then one future per element of X is used. Only

used if future.chunk.size is NULL.

future.chunk.size

The average number of elements per future ("chunk"). If Inf, then all elements are processed in a single future. If NULL, then argument future.scheduling is

used.

n The number of replicates.

expr An R expression to evaluate repeatedly.

simplify See base::sapply() and base::tapply(), respectively.

INDEX A list of one or more factors, each of same length as X. The elements are coerced

to factors by as.factor(). See also base::tapply().

default See base::tapply().

FUN. VALUE A template for the required return value from each FUN(X[ii],...). Types

may be promoted to a higher type within the ordering logical < integer < double

< complex, but not demoted. See base::vapply() for details.

... (optional) Additional arguments passed to FUN(). For future_*apply() func-

tions and replicate(), any future.* arguments part of ... are passed on to

future_lapply() used internally.

Value

A named (unless USE.NAMES = FALSE) list. See base::eapply() for details.

For future_lapply(), a list with same length and names as X. See base::lapply() for details.

future_replicate() is a wrapper around future_sapply() and return simplified object according to the simplify argument. See base::replicate() for details. Since future_replicate() usually involves random number generation (RNG), it uses future.seed = TRUE by default in order produce sound random numbers regardless of future backend and number of background workers used.

For future_sapply(), a vector with same length and names as X. See base::sapply() for details. future_tapply() returns an array with mode "list", unless simplify = TRUE (default) and FUN returns a scalar, in which case the mode of the array is the same as the returned scalars. See base::tapply() for details.

For future_vapply(), a vector with same length and names as X. See base::vapply() for details.

Global variables

Argument future.globals may be used to control how globals should be handled similarly how the globals argument is used with future(). Since all function calls use the same set of globals, this function can do any gathering of globals upfront (once), which is more efficient than if it would be done for each future independently. If TRUE, NULL or not is specified (default), then globals are automatically identified and gathered. If a character vector of names is specified, then those globals are gathered. If a named list, then those globals are used as is. In all cases, FUN and any ... arguments are automatically passed as globals to each future created as they are always needed.

Reproducible random number generation (RNG)

Unless future.seed = FALSE, this function guarantees to generate the exact same sequence of random numbers *given the same initial seed / RNG state* - this regardless of type of futures, scheduling ("chunking") strategy, and number of workers.

RNG reproducibility is achieved by pregenerating the random seeds for all iterations (over X) by using L'Ecuyer-CMRG RNG streams. In each iteration, these seeds are set before calling FUN(X[[ii]],...). *Note, for large* length(X) *this may introduce a large overhead.* As input (future.seed), a fixed seed (integer) may be given, either as a full L'Ecuyer-CMRG RNG seed (vector of 1+6 integers) or as a seed generating such a full L'Ecuyer-CMRG seed. If future.seed = TRUE, then .Random.seed is returned if it holds a L'Ecuyer-CMRG RNG seed, otherwise one is created randomly. If future.seed = NA, a L'Ecuyer-CMRG RNG seed is randomly created. If none of the function calls FUN(X[[ii]],...) uses random number generation, then future.seed = FALSE may be used.

In addition to the above, it is possible to specify a pre-generated sequence of RNG seeds as a list such that length(future.seed) == length(X) and where each element is an integer seed vector that can be assigned to .Random.seed. One approach to generate a set of valid RNG seeds based on fixed initial seed (here 42L) is:

Note that as.list(seq_along(X)) is not a valid set of such .Random.seed values.

In all cases but future.seed = FALSE, the RNG state of the calling R processes after this function returns is guaranteed to be "forwarded one step" from the RNG state that was before the call and in the same way regardless of future.seed, future.scheduling and future strategy used. This is done in order to guarantee that an R script calling future_lapply() multiple times should be numerically reproducible given the same initial seed.

Control processing order of elements

Attribute ordering of future.chunk.size or future.scheduling can be used to control the ordering the elements are iterated over, which only affects the processing order and *not* the order values are returned. This attribute can take the following values:

- index vector an numeric vector of length length(X)
- function an function taking one argument which is called as ordering(length(X)) and which much return an index vector of length length(X), e.g. function(n) rev(seq_len(n)) for reverse ordering.
- "random" this will randomize the ordering via random index vector sample.int(length(X)). For example, future.scheduling = structure(TRUE, ordering = "random"). *Note*, when elements are processed out of order, then captured standard output and conditions are also relayed in that order, that is out of order.

Author(s)

The implementations of future_replicate(), future_sapply(), and future_tapply() are adopted from the source code of the corresponding base R functions, which are licensed under GPL (>= 2) with 'The R Core Team' as the copyright holder.

Examples

```
stopifnot(all.equal(y1, y0))
y0 \leftarrow vapply(x, FUN = quantile, FUN.VALUE = double(5L))
y1 <- future_vapply(x, FUN = quantile, FUN.VALUE = double(5L))</pre>
print(y1)
stopifnot(all.equal(y1, y0))
## Parallel Random Number Generation
## Regardless of the future plan, the number of workers, and
## where they are, the random numbers produced are identical
plan(multisession)
y1 <- future_lapply(1:5, FUN = rnorm, future.seed = 0xBEEF)</pre>
str(y1)
plan(sequential)
y2 <- future_lapply(1:5, FUN = rnorm, future.seed = 0xBEEF)
str(y2)
stopifnot(all.equal(y1, y2))
## Process chunks of data.frame rows in parallel
iris <- datasets::iris</pre>
chunks <- split(iris, seq(1, nrow(iris), length.out = 3L))</pre>
y0 <- lapply(chunks, FUN = function(iris) sum(iris$Sepal.Length))</pre>
y0 <- do.call(sum, y0)</pre>
y1 <- future_lapply(chunks, FUN = function(iris) sum(iris$Sepal.Length))</pre>
y1 <- do.call(sum, y1)
print(y1)
stopifnot(all.equal(y1, y0))
```

future_Map

Apply a Function to Multiple List or Vector Arguments

Description

future_mapply() implements base::mapply() using futures with perfect replication of results, regardless of future backend used. Analogously to mapply(), future_mapply() is a multivariate version of future_sapply(). It applies FUN to the first elements of each ... argument, the second elements, the third elements, and so on. Arguments are recycled if necessary.

Usage

```
future_Map(f, ..., future.label = "future_Map-%d")
future_mapply(
 FUN,
  . . . ,
 MoreArgs = NULL,
 SIMPLIFY = TRUE,
 USE.NAMES = TRUE,
  future.stdout = TRUE,
  future.conditions = NULL,
  future.globals = TRUE,
  future.packages = NULL,
  future.lazy = FALSE,
  future.seed = FALSE,
  future.scheduling = 1,
  future.chunk.size = NULL,
  future.label = "future_mapply-%d"
)
future_.mapply(FUN, dots, MoreArgs, ..., future.label = "future_.mapply-%d")
```

Arguments

f A function of the arity k if future_Map() is called with k arguments.

future.label If a character string, then each future is assigned a label sprintf(future.label,chunk_idx).

If TRUE, then the same as future.label = "future_lapply-%d". If FALSE,

no labels are assigned.

FUN A function to apply, found via base::match.fun().

MoreArgs A list of other arguments to FUN.

SIMPLIFY A logical or character string; attempt to reduce the result to a vector, matrix or

higher dimensional array; see the simplify argument of base::sapply().

USE.NAMES A logical; use names if the first ... argument has names, or if it is a character

vector, use that character vector as the names.

future.stdout If TRUE (default), then the standard output of the underlying futures is captured,

and re-outputted as soon as possible. If FALSE, any output is silenced (by sinking it to the null device as it is outputted). If NA (not recommended), output is not

intercepted.

future.conditions

A character string of conditions classes to be captured and relayed. The default is the same as the condition argument of future::Future(). To not intercept conditions, use conditions = character(0L). Errors are always relayed.

future.globals A logical, a character vector, or a named list for controlling how globals are

handled. For details, see future_lapply().

future.packages

(optional) a character vector specifying packages to be attached in the R environment evaluating the future.

future.lazy Specifies whether the futures should be resolved lazily or eagerly (default).

future.seed A logical or an integer (of length one or seven), or a list of max(lengths(list(...)))

with pre-generated random seeds. For details, see future_lapply().

future.scheduling

Average number of futures ("chunks") per worker. If 0.0, then a single future is used to process all elements of X. If 1.0 or TRUE, then one future per worker is used. If 2.0, then each worker will process two futures (if there are enough elements in X). If Inf or FALSE, then one future per element of X is used. Only

used if future.chunk.size is NULL.

future.chunk.size

The average number of elements per future ("chunk"). If Inf, then all elements are processed in a single future. If NULL, then argument future. scheduling is

used.

dots A list of arguments to vectorize over (vectors or lists of strictly positive length,

or all of zero length).

... Arguments to vectorize over (vectors or lists of strictly positive length, or all of

zero length).

Details

Note that base::.mapply(), which future_.mapply() is modeled after is listed as an "internal" function in R despite being exported.

Value

future_Map() is a simple wrapper to future_mapply() which does not attempt to simplify the result. See base::Map() for details.

future_mapply() returns a list, or for SIMPLIFY = TRUE, a vector, array or list. See base::mapply() for details.

future_.mapply() returns a list. See base::.mapply() for details.

Author(s)

The implementations of future_Map() is adopted from the source code of the corresponding base R function Map(), which is licensed under GPL (>= 2) with 'The R Core Team' as the copyright holder.

Examples

```
## -----
## mapply()
## -------
y0 <- mapply(rep, 1:4, 4:1)
y1 <- future_mapply(rep, 1:4, 4:1)
stopifnot(identical(y1, y0))

y0 <- mapply(rep, times = 1:4, x = 4:1)
y1 <- future_mapply(rep, times = 1:4, x = 4:1)</pre>
```

```
stopifnot(identical(y1, y0))
y0 \leftarrow mapply(rep, times = 1:4, MoreArgs = list(x = 42))
y1 \leftarrow future_mapply(rep, times = 1:4, MoreArgs = list(x = 42))
stopifnot(identical(y1, y0))
y0 \leftarrow mapply(function(x, y) seq_len(x) + y,
             c(a = 1, b = 2, c = 3), # names from first
             c(A = 10, B = 0, C = -10))
y1 \leftarrow future_mapply(function(x, y) seq_len(x) + y,
                    c(a = 1, b = 2, c = 3), # names from first
                    c(A = 10, B = 0, C = -10))
stopifnot(identical(y1, y0))
word <- function(C, k) paste(rep.int(C, k), collapse = "")</pre>
y0 <- mapply(word, LETTERS[1:6], 6:1, SIMPLIFY = FALSE)</pre>
y1 <- future_mapply(word, LETTERS[1:6], 6:1, SIMPLIFY = FALSE)</pre>
stopifnot(identical(y1, y0))
## -----
## Parallel Random Number Generation
## Regardless of the future plan, the number of workers, and
## where they are, the random numbers produced are identical
plan(multisession)
y1 <- future_mapply(stats::runif, n = 1:4, max = 2:5,</pre>
                    MoreArgs = list(min = 1), future.seed = 0xBEEF)
print(y1)
plan(sequential)
y2 <- future_mapply(stats::runif, n = 1:4, max = 2:5,
                    MoreArgs = list(min = 1), future.seed = 0xBEEF)
print(y2)
stopifnot(all.equal(y1, y2))
```

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