

miceFast - Introduction

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2018-03-24

Loading the package and setting a seed:

```
library(miceFast)
set.seed(123456)
```

Motivations

Missing data is a common problem. The easiest solution is to delete observations for which a certain variable is missing. However this will sometimes deteriorate quality of a project. Another solution will be to use methods such as multiple/regular imputations to fill the missing data. Non missing independent variables could be used to approximate a missing observations for a dependent variable. R or Python language are user-friendly for data manipulation but parallelly brings slower computations. Languages such as C++ gives an opportunity to boost our applications or projects.

The presented miceFast package was built under Rcpp packages and the C++ library Armadillo. The Rcpp package offers functionality of exporting full C++ capabilities to the R environment. More precisely miceFast and corrData are offered. The first module offers capabilities of multiple imputations models with a closed-form solution. Thus package is based on linear algebra operations. The main upgrade is possibility of including a grouping and/or weighting (only for linear models) variable and functions enhancement by C++ capabilities. The second module was made for purpose of presenting the miceFast usage and performance. It provides functionality of generating correlated data with a discrete, binomial or continuous dependent variable and continuous independent variables.

Performance

Environment: MRO 3.4.1 Intel MKL - i7 6700HQ and 24GB DDR4 2133

MRO (Microsoft R Open) provide to R a sophisticated library for linear algebra operations so remember about that when reading a performance comparison. The biggest improvement in time performance could be achieved for a calculation where a grouping variable have to be used (around x50 depending on data dimensions and number of groups and even more than x1000). Another performance boost could be achieved for Linear Discriminant Analysis (x10).

If you are interested about the procedure of testing performance check performance_validity.R file at extdata folder.

```
system.file("extdata", "performance_validity.R", package = "miceFast")
```

Additional plots for simulations with certain parameters (but feel free to change them) are located:

```
system.file("extdata", "images", package = "miceFast")
```

miceFast was compared with the mice package. For grouping option there was used a basic R looping and the popular dplyr package.

Summing up, miceFast offer a relevant boost of calculations for LDA and all implemented models with a grouping variable.

Modules

Generating data with the `corrData` Module

Available constructors:

```
new(corrData,nr_cat,n_obs,means,cor_matrix)
```

```
new(corrData,n_obs,means,cor_matrix)
```

where:

- `nr_cat` : number of categories for discrete dependent variable
- `n_obs` : number of observations
- `means`: center independent variables
- `cor_mat` : positive defined correlation matrix

relevant class methods:

- `fill("type")` : generating data

`type`:character - possible options (“contin”,“binom”,“discrete”)

Imputing data with the `miceFast` Module:

Available constructors:

```
new(miceFast)
```

relevant class methods:

- `set_data(x)` - providing the data by a reference - a numeric matrix
- `get_data()` - retrieving the data
- `set_g(g)` - providing the grouping variable by a reference - a numeric vector - positive values
- `get_g()` - retrieving the grouping variable
- `set_w(w)` - providing the weighting variable by a reference - a numeric vector - positive values
- `get_w()` - retrieving the weighting variable
- `get_index()` - getting the index
- `impute("model",posit_y,posit_x)` - impute data under characteristics from object like a optional grouping or weighting variable
- `update_var(posit_y,imputations)` - permanently update variable at the object and data. WARNING, use it only if you are sure about model parameters.
- `get_models()` - possible quantitative models for a certain type of dependent variable
- `get_model()` - a recommended quantitative model for a certain type of dependent variable
- `which_updated()` - which variables were modified by `update_var` at the object (and data)
- `sort_byg()` - sort data by the grouping variable
- `is_sorted_byg()` - is data sorted by the grouping variable `x` : numeric matrix - variables
`g` : numeric vector - you could build it from several discrete variables
`w`: numeric vector with positive values - weights for weighted linear regressions
`model`: character - possible options (“lda”,“lm_pred”,“lm_bayes”,“lm_noise”)
`posit_y`: integer - position of dependent variable
`posit_x`: integer vector - positions of independent variables
`imputations` : numeric vector - imputations

For a simple mean add intercept to data and use “lm_pred”

Imputations

miceFast module usage:

```
#install.packages("mice")

data = cbind(as.matrix(mice::nhanes), intercept=1, index=1:nrow(mice::nhanes))

model = new(miceFast)
model$set_data(data) #providing data by a reference

model$update_var(2,model$impute("lm_pred",2,5)$imputations)

#OR not recommended
#data[,2] = model$impute("lm_pred",2,5)$imputations
#model$set_data(data) #Updating the object

model$update_var(3,model$impute("lda",3,c(1,2))$imputations)
model$update_var(4,rowMeans(sapply(1:10,function(x)
  model$impute("lm_bayes",4,c(1,2,3))$imputations))
)

#When working with 'Big Data'
#it is recommended to occasionally manually invoke a garbage collector `gc()`

# Be careful with `update_var` because of the permanent update at the object and data
# That is why `update_var` could be used only ones for a certain column
# check which variables was updated - inside the object
model$which_updated()

## [1] 2 3 4

head(model$get_data())

##      [,1]      [,2] [,3]      [,4] [,5] [,6]
## [1,]    1 26.5625    1 156.7972    1    1
## [2,]    2 22.7000    1 187.0000    1    2
## [3,]    1 26.5625    1 187.0000    1    3
## [4,]    3 26.5625    2 249.3683    1    4
## [5,]    1 20.4000    1 113.0000    1    5
## [6,]    3 26.5625    2 184.0000    1    6

rm(model)

head(mice::nhanes)

##   age  bmi hyp chl
## 1   1  NA  NA  NA
## 2   2 22.7   1 187
## 3   1  NA   1 187
## 4   3  NA  NA  NA
## 5   1 20.4   1 113
## 6   3  NA  NA 184
```

Model with additional parameters: - data sorted by the grouping variable

```
data = cbind(as.matrix(airquality[, -5]), intercept=1, index=1:nrow(airquality))
weights = rgamma(nrow(data), 3, 3) # a numeric vector - positive values
groups = as.numeric(airquality[, 5]) # a numeric vector not integers - positive values - sorted increasingly

model = new(miceFast)
model$set_data(data) # providing data by a reference
model$set_w(weights)
model$set_g(groups)
#impute adapt to provided parameters like w or g
#Warning - if data is not sorted increasingly by the g then it would be done automatically
#during a first imputation
#Simple mean - permanent imputation at the object and data
model$update_var(1, model$impute("lm_pred", 1, c(6))$imputations)

model$update_var(2, rowMeans(sapply(1:10, function(x)
  model$impute("lm_bayes", 2, c(1, 3, 4, 5, 6))$imputations))
))
#Printing data and retrieving an old order
head(cbind(model$get_data(), model$get_g(), model$get_w())[order(model$get_index()), ], 4)

##      [,1] [,2] [,3] [,4] [,5] [,6] [,7] [,8]      [,9]
## [1,]   41  190  7.4   67    1    1    1    5 0.8042191
## [2,]   36  118  8.0   72    2    1    2    5 1.5597434
## [3,]   12  149 12.6   74    3    1    3    5 0.4004544
## [4,]   18  313 11.5   62    4    1    4    5 0.4909557

head(airquality, 4)

##      Ozone Solar.R Wind Temp Month Day
## 1     41     190   7.4   67     5   1
## 2     36     118   8.0   72     5   2
## 3     12     149  12.6   74     5   3
## 4     18     313  11.5   62     5   4

head(cbind(model$get_data(), model$get_g(), model$get_w()), 4)

##      [,1] [,2] [,3] [,4] [,5] [,6] [,7] [,8]      [,9]
## [1,]   41  190  7.4   67    1    1    1    5 0.8042191
## [2,]   36  118  8.0   72    2    1    2    5 1.5597434
## [3,]   12  149 12.6   74    3    1    3    5 0.4004544
## [4,]   18  313 11.5   62    4    1    4    5 0.4909557

head(cbind(data, groups, weights), 4)

##      Ozone Solar.R Wind Temp Day intercept index groups  weights
## [1,]   41     190   7.4   67    1          1     1     5 0.8042191
## [2,]   36     118   8.0   72    2          1     2     5 1.5597434
## [3,]   12     149  12.6   74    3          1     3     5 0.4004544
## [4,]   18     313  11.5   62    4          1     4     5 0.4909557

rm(model)
```

Model with additional parameters: - data not sorted by the grouping variable

```
data = cbind(as.matrix(airquality[,-5]),intercept=1,index=1:nrow(airquality))
weights = rgamma(nrow(data),3,3) # a numeric vector - positive values
#groups = as.numeric(airquality[,5]) # a numeric vector not integers - positive values
groups = as.numeric(sample(1:3,nrow(data),replace=T)) # a numeric vector not integers - positive values

model = new(miceFast)
model$set_data(data) # providing data by a reference
model$set_w(weights)
model$set_g(groups)
#impute adapt to provided parameters like w or g
#Warning - if data is not sorted increasingly by the g then it would be done automatically
#during a first imputation
#Simple mean - permanent imputation at the object and data
model$update_var(1,model$impute("lm_pred",1,c(6))$imputations)
```

```
## Warning in model$impute("lm_pred", 1, c(6)):  
## Data was sorted by the grouping variable - use `get_index()` to retrieve an order  
model$update_var(2,rowMeans(sapply(1:10,function(x)  
  model$impute("lm_bayes",2,c(1,3,4,5,6))$imputations))  
  )  
#Printing data and retrieving an old order  
head(cbind(model$get_data(),model$get_g(),model$get_w())[order(model$get_index()),],4)
```

```
##      [,1] [,2] [,3] [,4] [,5] [,6] [,7] [,8] [,9]  
## [1,]  41  190  7.4  67    1    1    1    3 1.670560  
## [2,]  36  118  8.0  72    2    1    2    2 1.041644  
## [3,]  12  149 12.6  74    3    1    3    2 1.680337  
## [4,]  18  313 11.5  62    4    1    4    1 0.200267
```

```
head(airquality,4)
```

```
##   Ozone Solar.R Wind Temp Month Day  
## 1    41    190  7.4   67     5   1  
## 2    36    118  8.0   72     5   2  
## 3    12    149 12.6   74     5   3  
## 4    18    313 11.5   62     5   4
```

```
head(cbind(model$get_data(),model$get_g(),model$get_w()),4) #is ordered by g
```

```
##      [,1]      [,2] [,3] [,4] [,5] [,6] [,7] [,8] [,9]  
## [1,]  18 313.0000 11.5  62    4    1    4    1 0.2002670  
## [2,]  28 218.3573 14.9  66    6    1    6    1 0.6724756  
## [3,]  19  99.0000 13.8  59    8    1    8    1 0.9913337  
## [4,]   8  19.0000 20.1  61    9    1    9    1 0.3370238
```

```
head(cbind(data,groups,weights),4) #is sorted by g cause we provide data by a reference
```

```
##      Ozone  Solar.R Wind Temp Day intercept index groups  weights  
## [1,]    18 313.0000 11.5  62    4          1     4      1 0.2002670  
## [2,]    28 218.3573 14.9  66    6          1     6      1 0.6724756  
## [3,]    19  99.0000 13.8  59    8          1     8      1 0.9913337  
## [4,]     8  19.0000 20.1  61    9          1     9      1 0.3370238
```

```
rm(model)
```