# Analysis of data from aCGH experiments using parallel computing and ff objects: long list of examples

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## 1 This vignette

We provide here example calls of all segmentation methods, with different options for methods, as well as different options for type of input object and clustering. This is provided here as both extended help and as a simple way of checking that all the functions can be run and yield the same results regardless of type of input and clustering.

## 2 Creating objects

We must ensure that we can run this vignette as stand alone. Thus, we load the package and create all necessary objects. This repeats work done in the main vignette.

We first try to move to the "/tmp" directory, if it exists. If it does not, the code will be executed in your current directory.

- > try(setwd("~/tmp"))
- > library(ADaCGH2)
- > ## loading in-RAM objects
- > data(inputEx)
- > summary(inputEx)

```
ΙD
                   chromosome
                                    position
                                                          L.1
Hs.101850:
                         :1.00
             1
                 Min.
                                 Min.
                                        :1.18e+06
                                                            :-1.078
                                                     1st Qu.:-0.226
Hs.1019 :
                 1st Qu.:1.00
                                 1st Qu.:3.60e+07
Hs.105460:
                 Median :2.00
                                 Median :7.08e+07
                                                     Median :-0.016
Hs.105656: 1
                 Mean
                         :2.28
                                 Mean
                                        :9.26e+07
                                                     Mean
                                                            :-0.035
                 3rd Qu.:3.00
                                                     3rd Qu.: 0.160
Hs.105941:
             1
                                 3rd Qu.:1.50e+08
Hs.106674:
                 Max.
                        :5.00
                                        :2.44e+08
                                                     Max.
                                                            : 0.883
 (Other) :494
                                                     NA's
                                                            :5
     L.2
                                                           L3
                        m4
                                          m5
Min.
        :-0.795
                          :-0.187
                                    Min.
                                            :-4.67
                                                     Min.
                                                            :-13.27
                  Min.
 1st Qu.:-0.139
                  1st Qu.: 1.979
                                    1st Qu.:-0.02
                                                     1st Qu.:
                                                               3.63
Median :-0.006
                  Median : 2.281
                                    Median: 0.44
                                                     Median :
                                                               3.92
Mean
        : 0.008
                  Mean
                         : 3.450
                                    Mean
                                           : 1.60
                                                     Mean
                                                               1.98
                  3rd Qu.: 5.824
3rd Qu.: 0.134
                                    3rd Qu.: 3.04
                                                     3rd Qu.: 4.11
        : 1.076
                  Max.
                         : 6.604
                                    Max.
                                            : 9.60
                                                     Max.
                                                            : 6.37
Max.
NA's
                                    NA's
                                            :41
                                                     NA's
        :15
                                                            :9
       m6
Min.
        :-0.77
1st Qu.:-0.23
Median :-0.04
Mean
        :-0.04
3rd Qu.: 0.16
Max.
        : 0.78
NA's
        :203
> head(inputEx)
                              ID chromosome position
                                                        L.1
                                                               L.2
                                                                       m4
                                                                             m5
                      Hs.212680
1*1180411*Hs.212680
                                          1
                                              1180411
                                                         NA
                                                             0.038 6.226 3.226
1*1188041.5*Hs.129780 Hs.129780
                                              1188042
                                                         NA 0.028 6.174 3.174
1*1194444*Hs.42806
                       Hs.42806
                                          1
                                              1194444
                                                         NA 0.042 6.174 3.174
1*1332537*Hs.76239
                       Hs.76239
                                          1
                                             1332537
                                                         NA
                                                            0.285 5.624 2.624
                                                         NA 0.058 5.851 2.851
1*2362211*Hs.40500
                       Hs.40500
                                          1
                                             2362211
1*2372287*Hs.449936
                      Hs.449936
                                             2372287 0.294 -0.006 5.685 2.685
                         L3 m6
1*1180411*Hs.212680
                      6.038 NA
1*1188041.5*Hs.129780 6.028 NA
1*1194444*Hs.42806
                      6.042 NA
1*1332537*Hs.76239
                         NA NA
1*2362211*Hs.40500
                         NA NA
1*2372287*Hs.449936
                         NA NA
> cgh.dat <- inputEx[, -c(1, 2, 3)]</pre>
> chrom.dat <- as.integer(inputEx[, 2])</pre>
> pos.dat <- inputEx[, 3]</pre>
> ## choosing working dir for cluster
> originalDir <- getwd()</pre>
> if(!file.exists("ADaCGH2_vignette_tmp_dir"))
    dir.create("ADaCGH2_vignette_tmp_dir")
> setwd("ADaCGH2_vignette_tmp_dir")
> ## creating ff objects
> fnameRdata <- list.files(path = system.file("data", package = "ADaCGH2"),</pre>
                       full.names = TRUE, pattern = "inputEx.RData")
```

```
> inputToADaCGH(ff.or.RAM = "ff",
                        RDatafilename = fnameRdata)
   ... done reading; starting checks
      ... checking identical MidPos
      ... checking need to reorder inputData, data.frame version
   ... done with checks; starting writing
   ... done writing/saving probeNames
   ... done writing/saving chromData
   ... done writing/saving posData
   ... done writing/saving cghData
 Calling gc at end
          used (Mb) gc trigger (Mb) max used (Mb)
Ncells 1557642 83.2
                       2403845 128.4 1835812 98.1
Vcells 1528388 11.7
                       2481603 19.0 2001668 15.3
Files saved in current directory
/home/ramon/tmp/ADaCGH2_vignette_tmp_dir
with names :
chromData.RData, posData.RData, cghData.RData, probeNames.RData.
> ## setting random number generator for forking
> RNGkind("L'Ecuyer-CMRG")
> ## initializing cluster and setting up random number generator
> number.of.nodes <- detectCores()</pre>
> cl2 <- parallel::makeCluster(number.of.nodes, "PSOCK")</pre>
> parallel::clusterSetRNGStream(cl2)
> parallel::setDefaultCluster(cl2)
> parallel::clusterEvalQ(NULL, library("ADaCGH2"))
[[1]]
                             "bit"
 [1] "ADaCGH2"
                 "ff"
                                                                  "methods"
                                          "tools"
                                                      "parallel"
 [7] "stats"
                 "graphics" "grDevices" "utils"
                                                      "datasets"
                                                                  "base"
[[2]]
 [1] "ADaCGH2"
                 "ff"
                             "bit"
                                          "tools"
                                                      "parallel"
                                                                  "methods"
 [7] "stats"
                                                      "datasets"
                                                                  "base"
                 "graphics" "grDevices" "utils"
[[3]]
 [1] "ADaCGH2"
                 "ff"
                             "bit"
                                          "tools"
                                                      "parallel"
                                                                  "methods"
 [7] "stats"
                                                      "datasets"
                 "graphics" "grDevices" "utils"
                                                                  "base"
[[4]]
```

```
"ff"
                                                       "parallel"
 [1] "ADaCGH2"
                              "bit"
                                          "tools"
                                                                   "methods"
 [7] "stats"
                 "graphics" "grDevices" "utils"
                                                       "datasets"
                                                                   "base"
> ## verify we are using the right version of ADaCGH2
> parallel::clusterEvalQ(NULL,
                          library(help = ADaCGH2)$info[[1]][[2]])
[[1]]
[1] "Version:
                    2.3.6"
[[2]]
[1] "Version:
                    2.3.6"
[[3]]
[1] "Version:
                    2.3.6"
[[4]]
[1] "Version:
                    2.3.6"
> wdir <- getwd()</pre>
> parallel::clusterExport(NULL, "wdir")
> parallel::clusterEvalQ(NULL, setwd(wdir))
[1] "/home/ramon/tmp/ADaCGH2_vignette_tmp_dir"
[[2]]
[1] "/home/ramon/tmp/ADaCGH2_vignette_tmp_dir"
[[3]]
[1] "/home/ramon/tmp/ADaCGH2_vignette_tmp_dir"
[[4]]
[1] "/home/ramon/tmp/ADaCGH2_vignette_tmp_dir"
>
```

### 3 The examples

#### 3.1 RAM objects and forking

```
> glad.RAM.fork <- pSegmentGLAD(cgh.dat, chrom.dat)</pre>
> biohmm.mergel.RAM.fork <- pSegmentBioHMM(cgh.dat,
                                   chrom.dat,
                                   pos.dat,
                                  merging = "mergeLevels")
> biohmm.mad.RAM.fork <- pSegmentBioHMM(cgh.dat,
                                           chrom.dat,
                                           pos.dat,
                                           merging = "MAD")
> biohmm.mad.bic.RAM.fork <- pSegmentBioHMM(cgh.dat,
                                               chrom.dat,
                                               pos.dat,
                                               merging = "MAD",
                                               aic.or.bic = "BIC")
> cghseg.mergel.RAM.fork <- pSegmentCGHseg(cgh.dat,
                                             chrom.dat,
                                             merging = "mergeLevels")
> cghseg.mad.RAM.fork <- pSegmentCGHseg(cgh.dat,
                                           chrom.dat,
                                           merging = "MAD")
> cghseg.none.RAM.fork <- pSegmentCGHseg(cgh.dat,
                                            chrom.dat,
                                            merging = "none")
> waves.mergel.RAM.fork <- pSegmentWavelets(cgh.dat,
                              chrom.dat, merging = "mergeLevels")
> waves.mad.RAM.fork <- pSegmentWavelets(cgh.dat,
                                            chrom.dat, merging = "MAD")
> waves.none.RAM.fork <- pSegmentWavelets(cgh.dat,
                                             chrom.dat, merging = "none")
```

#### 3.2 ff objects and cluster

Compared to the section 3.1, the main differences are that we explicitly set the typeParall argument to "cluster" (the default is "fork") and the change in the names of the input data (which now refer to the names of the RData objects that contain the ff objects).

```
> hs.mergel.ff.cluster <- pSegmentHaarSeg("cghData.RData", "chromData.RData",
                               merging = "mergeLevels",
                                       typeParall = "cluster")
> hs.mad.ff.cluster <- pSegmentHaarSeg("cghData.RData", "chromData.RData",
                               merging = "MAD", typeParall = "cluster")
> hs.none.ff.cluster <- pSegmentHaarSeg("cghData.RData", "chromData.RData",
                               merging = "none", typeParall = "cluster")
> glad.ff.cluster <- pSegmentGLAD("cghData.RData", "chromData.RData",
                                   typeParall = "cluster")
> biohmm.mergel.ff.cluster <- pSegmentBioHMM("cghData.RData",
                                   "chromData.RData",
                                   "posData.RData",
                                   merging = "mergeLevels",
                                       typeParall = "cluster")
> biohmm.mad.ff.cluster <- pSegmentBioHMM("cghData.RData",
                                           "chromData.RData",
                                           "posData.RData",
                                           merging = "MAD",
                                           typeParall = "cluster")
> biohmm.mad.bic.ff.cluster <- pSegmentBioHMM("cghData.RData",</pre>
                                               "chromData.RData",
                                               "posData.RData",
                                               merging = "MAD",
                                               aic.or.bic = "BIC",
                                               typeParall = "cluster")
> cghseg.mergel.ff.cluster <- pSegmentCGHseg("cghData.RData",
                                             "chromData.RData",
                                             merging = "mergeLevels",
                                             typeParall = "cluster")
> cghseg.mad.ff.cluster <- pSegmentCGHseg("cghData.RData",
                                           "chromData.RData",
                                           merging = "MAD",
                                           typeParall = "cluster")
> cghseg.none.ff.cluster <- pSegmentCGHseg("cghData.RData",
                                            "chromData.RData",
                                            merging = "none",
                                            typeParall = "cluster")
> waves.mergel.ff.cluster <- pSegmentWavelets("cghData.RData",</pre>
                                              "chromData.RData",
                                              merging = "mergeLevels",
                                              typeParall = "cluster")
> waves.mad.ff.cluster <- pSegmentWavelets("cghData.RData",
                                            "chromData.RData",
                                            merging = "MAD",
+
                                            typeParall = "cluster")
> waves.none.ff.cluster <- pSegmentWavelets("cghData.RData",
                                             "chromData.RData",
                                             merging = "none",
                                             typeParall = "cluster")
```

#### 3.3 ff objects and forking

The main difference with section 3.2 is the argument typeParall; we did not need to pass it explicitly (since the default is fork), but we will do for clarity.

```
> cbs.mergel.ff.fork <- pSegmentDNAcopy("cghData.RData", "chromData.RData",
+
                                        merging = "mergeLevels",
                                    typeParall = "fork")
> cbs.mad.ff.fork <- pSegmentDNAcopy("cghData.RData", "chromData.RData",
                                     merging = "MAD",
                                        typeParall = "fork")
> cbs.none.ff.fork <- pSegmentDNAcopy("cghData.RData", "chromData.RData",
                                      merging = "none", typeParall = "fork")
> hmm.mergel.ff.fork <- pSegmentHMM("cghData.RData", "chromData.RData",
                             merging = "mergeLevels", typeParall = "fork")
> hmm.mad.ff.fork <- pSegmentHMM("cghData.RData", "chromData.RData",
                                 merging = "MAD", typeParall = "fork")
> hs.mergel.ff.fork <- pSegmentHaarSeg("cghData.RData", "chromData.RData",
                               merging = "mergeLevels", typeParall = "fork")
> hs.mad.ff.fork <- pSegmentHaarSeg("cghData.RData", "chromData.RData",
                               merging = "MAD", typeParall = "fork")
> hs.none.ff.fork <- pSegmentHaarSeg("cghData.RData", "chromData.RData",
                               merging = "none", typeParall = "fork")
> glad.ff.fork <- pSegmentGLAD("cghData.RData", "chromData.RData",
                               typeParall = "fork")
> biohmm.mergel.ff.fork <- pSegmentBioHMM("cghData.RData",
                                  "chromData.RData",
                                  "posData.RData",
                                  merging = "mergeLevels",
                                   typeParall = "fork")
> biohmm.mad.ff.fork <- pSegmentBioHMM("cghData.RData",
                                           "chromData.RData",
                                           "posData.RData",
                                          merging = "MAD",
                                       typeParall = "fork")
> biohmm.mad.bic.ff.fork <- pSegmentBioHMM("cghData.RData",
                                               "chromData.RData",
                                              "posData.RData",
                                              merging = "MAD",
                                              aic.or.bic = "BIC",
                                           typeParall = "fork")
> cghseg.mergel.ff.fork <- pSegmentCGHseg("cghData.RData",
                                             "chromData.RData",
                                            merging = "mergeLevels",
                                         typeParall = "fork")
> cghseg.mad.ff.fork <- pSegmentCGHseg("cghData.RData",
                                           "chromData.RData",
                                          merging = "MAD", typeParall = "fork")
> cghseg.none.ff.fork <- pSegmentCGHseg("cghData.RData",
                                            "chromData.RData",
                                           merging = "none", typeParall = "fork")
> waves.merge.ff.fork <- pSegmentWavelets("cghData.RData",
                                           "chromData.RData",
```

#### 3.4 Comparing output

Here we verify that using different input and clustering methods does not change the results. Before carrying out the comparisons, however, we open the f objects gently.

First, we will open the objects created above (same objects as were also created in the main vignette, in section "Carrying out segmentation and calling"). Instead of inserting many calls to each individual object, we open all available objects that match ff.cluster. To do that quickly we store the names of the objects

And we create the list of results from the RAM and forking runs (no need for special opening here, since these are not ff objects)

```
> RAM.fork.obj <- ls(pattern = "*.RAM.fork")</pre>
```

We can now compare the output. We want to compare the output from three different methods, so we need to run three comparisons (this is what we did explicitly in the help for pSegment). Since this is a very repetitive operation, we define a small utility function that will return TRUE if both components (outSmoothed and outState) of all three objects are identical. (Since the function will take as input not an actual object, but a name, we use get inside the function.)

We use all.equal to compare the output from the smoothing, to allow for possible numerical fuzz (that could result from differences in storage). When comparing the assigned state, however, we check for exact identity.

```
> identical3 <- function(x, y, z) {</pre>
    comp1 <- all.equal(get(x)$outSmoothed[ , ], get(y)$outSmoothed[ , ])</pre>
    comp2 <- all.equal(get(y)$outSmoothed[ , ], get(z)$outSmoothed[ , ])</pre>
    comp3 <- identical(get(x)$outState[ , ], get(y)$outState[ , ])</pre>
    comp4 <- identical(get(y)$outState[ , ], get(z)$outState[ , ])</pre>
    if (!all(isTRUE(comp1), isTRUE(comp2), comp3, comp4)) {
      cat(paste("Comparing ", x, y, z, "\n",
             "not equal: some info from comparisons.\n",
                 "\n comp1 = ", paste(comp1, sep = " ", collapse = "\n
                                                                             "),
                 "\n comp2 = ", paste(comp2, sep = " ", collapse = "\n
                                                                             "),
                                                                             "),
                 "\n comp3 = ", paste(comp3, sep = " ", collapse = "\n
                 "\n comp4 = ", paste(comp4, sep = " ", collapse = "\n
                                                                             "),
                 "\n\n"))
      return(FALSE)
    } else {
      TRUE
    }
+ }
```

You should expect most (though not necessarily all) the comparisons to yield a TRUE. In some cases, however, different runs of the same method might not yield the same results (e.g., CBS, HMM, etc). If you get non-identical results, you can try running those methods a few times, to check for differences. You can also disable load balancing, and try using reproducible streams for the random number generators (see the vignette of package **parallel**).

Let's check those results then:

```
> mapply(identical3, RAM.fork.obj,
            ff.fork.obj, ff.cluster.obj)
Comparing cbs.mad.RAM.fork cbs.mad.ff.fork cbs.mad.ff.cluster
not equal: some info from comparisons.
comp1 =
         TRUE
comp2 = Component 4: Mean relative difference: 0.0334
comp3 = TRUE
comp4 = TRUE
Comparing glad.RAM.fork glad.ff.fork glad.ff.cluster
not equal: some info from comparisons.
comp1 = TRUE
comp2 = Component 4: Mean relative difference: 4.221
comp3 = TRUE
comp4 = FALSE
Comparing hmm.mad.RAM.fork hmm.mad.ff.fork hmm.mad.ff.cluster
not equal: some info from comparisons.
comp1 =
         TRUE
comp2 =
         Component 3: Mean relative difference: 0.02516
comp3 = TRUE
 comp4 = TRUE
```

Comparing hmm.mergel.RAM.fork hmm.mergel.ff.fork hmm.mergel.ff.cluster

TRUE cbs.none.RAM.fork **FALSE** TRUE TRUE cghseg.mad.RAM.fork cghseg.mergel.RAM.fork cghseg.none.RAM.fork TRUE TRUE TRUE hmm.mad.RAM.fork glad.RAM.fork hmm.mergel.RAM.fork FALSE FALSE FALSE hs.mad.RAM.fork hs.mergel.RAM.fork hs.none.RAM.fork TRUE TRUE waves.mad.RAM.fork waves.mergel.RAM.fork waves.none.RAM.fork TRUE TRUE TRUE.

>

(Of course, we depend on the lists of names of objects having the output from the same method and option in the same position, which is the case in these examples).

## 4 Exercising the code for the load balancing options

This section simply exercises the load balancing options. We use Haar as it is the fastest method, and one unlikely to be affected by the order in which different columns are run (in contrast to, say, HMM), so we need not worry about random numbers here.

```
> hs.none.RAM.fork <- pSegmentHaarSeg(cgh.dat, chrom.dat,
                               merging = "none")
> hs.none.RAM.fork.lb <- pSegmentHaarSeg(cgh.dat, chrom.dat,
                               merging = "none", loadBalance = TRUE)
> hs.none.RAM.fork.nlb <- pSegmentHaarSeg(cgh.dat, chrom.dat,
                               merging = "none", loadBalance = FALSE)
> identical3("hs.none.RAM.fork", "hs.none.RAM.fork.lb", "hs.none.RAM.fork.nlb")
[1] TRUE
> hs.none.ff.cluster <- pSegmentHaarSeg("cghData.RData", "chromData.RData",
                                        merging = "none", typeParall = "cluster")
> hs.none.ff.cluster.lb <- pSegmentHaarSeg("cghData.RData", "chromData.RData",
                                        merging = "none", typeParall = "cluster",
                                        loadBalance = TRUE)
> hs.none.ff.cluster.nlb <- pSegmentHaarSeg("cghData.RData", "chromData.RData",
                                        merging = "none", typeParall = "cluster",
                                        loadBalance = FALSE)
> ## do not show all the opening ... messages
```

```
> tmpout <-
    capture.output(
      lapply("hs.none.ff.cluster", function(x) lapply(get(x), open))
> tmpout <-
   capture.output(
      lapply("hs.none.ff.cluster.lb", function(x) lapply(get(x), open))
> tmpout <-
+
   capture.output(
      lapply("hs.none.ff.cluster.nlb", function(x) lapply(get(x), open))
> identical3("hs.none.ff.cluster", "hs.none.ff.cluster.lb",
             "hs.none.ff.cluster.nlb")
[1] TRUE
> hs.none.ff.fork <- pSegmentHaarSeg("cghData.RData", "chromData.RData",
                               merging = "none", typeParall = "fork")
> hs.none.ff.fork.lb <- pSegmentHaarSeg("cghData.RData", "chromData.RData",
                                     merging = "none", typeParall = "fork",
                                     loadBalance = TRUE)
> hs.none.ff.fork.nlb <- pSegmentHaarSeg("cghData.RData", "chromData.RData",
                                     merging = "none", typeParall = "fork",
                                     loadBalance = FALSE)
> tmpout <-
   capture.output(
      lapply("hs.none.ff.fork", function(x) lapply(get(x), open))
> tmpout <-
   capture.output(
      lapply("hs.none.ff.fork.lb", function(x) lapply(get(x), open))
> tmpout <-
   capture.output(
      lapply("hs.none.ff.fork.nlb", function(x) lapply(get(x), open))
> identical3("hs.none.ff.fork", "hs.none.ff.fork.lb", "hs.none.ff.fork.nlb")
[1] TRUE
```

(There is no need to compare between ff.fork, ff.cluster, RAM.fork, as those were already shown to be identical.)

## 5 Clean up actions

These are not strictly necessary, but we will explicitly stop the cluster. In this vignette, we will not execute the code below to remove the directory we created or the objects, in case you want to check them out or play around with them, but the code is below.

To make sure there are no file permission problems, we add code below to explicitly delete some of the "ff" files and objects (and we wait a few seconds to allow pending I/O operations to happen before we delete the directory).

```
> parallel::stopCluster(c12)
> ## This is the code to remove all the files we created
> ## and the temporary directory.
> ## We are not executing it!
> load("chromData.RData")
> load("posData.RData")
> load("cghData.RData")
> delete(cghData); rm(cghData)
> delete(posData); rm(posData)
> delete(chromData); rm(chromData)
> tmpout <-
    capture.output(
      lapply(ff.fork.obj, function(x) {
        lapply(get(x), delete)}))
> rm(list = ff.fork.obj)
> tmpout <-
    capture.output(
      lapply(ff.cluster.obj, function(x) {
        lapply(get(x), delete)}))
> rm(list = ff.cluster.obj)
> setwd(originalDir)
> print(getwd())
> Sys.sleep(3)
> unlink("ADaCGH2_vignette_tmp_dir", recursive = TRUE)
> Sys.sleep(3)
```