R PROFILING AND OPTIMISATION

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PENDING CHANGES

- Control information may be included as special stack in raw format.
- A list of profiles may become default. Only one profiling interval value per profile.
- Nodes may implemented as factor.

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Profiling facilities in R

R provides the basic instruments for profiling, both for time based samplers as for event based instrumentation. However this source of information seems to be rarely used.

Maybe the supporting tools are not adequate. The summaries provided by R reduce the information beyond necessity. Additional packages are available, but these are not sufficiently action oriented.

With package **sprof** we want to give a data representation that keeps the full profile information. Tools to answer common questions are provided. The data structure should make it easy to extend the tools as required.

The package is currently distributed at r-forge as part of the sintro material.

```
To install this package directly within R, type install.packages("sprof",repos="http://r-forge.r-project.org")
```

To install the recent package from source directly within R, type install.packages("sprof",repos="http://r-forge.r-project.org",type="source")

LATEX LAYOUT TOOLS AND UTILITIES

Print parameters used here:

```
options(width = 72)
options(digits = 6)
```

We want immediate warnings, if necessary. Set to level 2 to handle warnings as error.

For larger tabels and data frames, we use a cludge to avoid long outputs.

```
Input
xcutdata.frame <- function(df, cut, margin){
#! keep3, to add: margin top - random center - margin bottom
if (!is.data.frame(df)) return(df)
nrow <- nrow(df)
# cut a range if it is not empty. Quiet noop else. Does not cut single lines.
cutrng <- function(cutfrom, cutto){
    if (cutfrom<cutto){
        df[cutfrom,] <- NA
        if (!is.null(rownames(df))) rownames(df)[cutfrom] <- "< cut >"
        if (!is.null(df$name)) df$name[cutfrom] <- ""</pre>
```

```
df[-(cutfrom:cutto),]
                 }#if
        }
        if (!missing(cut)) {df <- cutrng(cut[1],cut[2]); return(df)}</pre>
        if (!missing(margin)) {
                 if (length(margin)==1) margin <- c(margin, margin)</pre>
        cut <- c(margin[1]+1,nrow-margin[2])</pre>
        df <-cutrng(cut[1],cut[2]);</pre>
        return(df)}
#
         if (!missing(keep3)) { cut <- c(keep3[1]+1, keep3[1]+1,
                  nrow-keep3[3]-1,nrow-keep3[3]-1)
         if (cut[3]-cut[4] > keep3[2]+2){delta<-(cut[3]-cut[2]) div 2; cut[3]<-0
#
         browser()
         } else df <- cutrng(cut[1],cut[4])</pre>
         cutrng(cut[1],cut[4]) return(df)}
```

We use the R function xtable() for output and LaTeX longtable. A convenient wrapper to use this in out Sweave source is:

This is to be used with <<pre>rint = FALSE, results = tex, label=tab:prxxxx>>=

1. Profiling

The basic information provided by all profilers in is a protocol of sampled stacks. For each recorded event, the protocol has one record, such as a line with a text string showing the sampled stack.

We use profiles to provide hints on the dynamic behaviour of programs. Most often, this is used to improve or even optimise programs. Sometimes, it is even used to understand some algorithm.

Profiles represent the program flow, which is considered to be laid out by the control structure of a program. The control structure is represented by the control graph, and this leads to the common approach to (re)construct the control graph, map the profile to this graph, and used graph based methods for further analysis. The prime example for this strategy is the GNU profiler <code>gprof</code> (see http://sourceware.org/binutils/docs/gprof/) which is used as master plan for many common profilers.

It is only half of the truth that the control graph can serve as a base for the profiled stacks. In R, we have some peculiarities.

- lazy evaluation: Arguments to functions can passed as promises. These are only evaluated when needed, which may be at a later time, and may then lead to insertions in the stack. So we may have information resulting from the data flow, interspersed with the control flow.
- **memory management:** Allocation of memory, and garbage collection, may interfere and leave their traces in the stack. While allocation is closely related to the visible control flow, garbage collection is a collective effect largely out of control of the code to execute.
- **primitives:** Internal functions may escape the usual stack conventions and execute without leaving any identifiable trace on the stack.
- control structures: In R, many control structures are implemented as function. Most notably, the <code>apply()</code> family appear as function calls and lead to cliques in the graph representation that do not correspond to relevnat structures. Since these functions are well know, they can have a special treatment.

So while the stack follows an overall well known dynamics, in R there are exceptions from regularity. The general approach, by <code>summaryRprof()</code> and others, is to reduce

the profile to node information, or two consider single transitions.

We take a different approach. We take the stacks, as recorded in the profiles as our basic information unit. From this, we ask: what are the actions we need to answer our questions? Representation in graphs may come later, if they can help.

If the stacks would come from the control flow only, we could make use of the sequential nature of stacks. But since we have to live with the R specific interferences, we stay with the raw stacks.

In this presentation, we will use a small list of examples Since *Rprof* is not implemented on all systems, and since the profiles tend to get very large, we use some prepared examples that are frozen in this vignette and not included in the distribution, but all the code to generate the examples is provided.

1.1. Simple regression example.

```
n <- 10000
x <- runif(n)
err <- rnorm(n)
y <- 2+ 3 * x + err
regOdata <- data.frame(x=x, y=y, err=err)
rm(x,y,err)</pre>
```

We will use this example to illustrate the basics. Of course the immediate questions are the variance between varying samples, and the influence of the sample size n. We keep everything fixed, so the only issue for now is the computational performance under strict iid conditions.

Still we have parameters to choose. We can determine the profiling granularity by setting the timing interval, and we can use repeated measurements to increase precision below the timing interval.

The timing interval should depend on the clock speed. Using for example 1ms amounts to some 1000 steps on a current CPU, per kernel.

If we use repeated samples, the usual rules of statistics applies. So taking 100 runs and taking the mean reduces the standard deviation by a factor 1/10.

```
profinterval <- 0.001
simruns <- 100
Rprof(filename="RprofsRegressionExpl.out", interval = profinterval)
for (i in 1:simruns) xxx<- summary(lm(y~x, data=reg0data))
Rprof(NULL)
```

We now have the profile data in a file RprofsRegressionExpl.out. For this vignette, we use a frozen version RprofsRegressionExpl01.out.

1.1.1. R basic. The basic R invites us to get a summary.

```
sumRprofRegressionExpl <- summaryRprof("RprofsRegressionExpl01.out")</pre>
str(sumRprofRegressionExpl, vec.len=3)
                                  _ Output -
List of 4
$ by.self
                  :'data.frame':
                                        41 obs. of 4 variables:
  ..$ self.time : num [1:41] 0.087 0.057 0.051 0.043 0.042 0.04 0.032 0.026 ...
  ..$ self.pct : num [1:41] 16.67 10.92 9.77 8.24 ...
 ..$ total.time: num [1:41] 0.113 0.099 0.069 0.043 0.474 0.045 0.033 0.114 ...
  ..$ total.pct : num [1:41] 21.65 18.97 13.22 8.24 ...
                                        62 obs. of 4 variables:
$ by.total
                  :'data.frame':
  ..$ total.time: num [1:62] 0.522 0.522 0.521 0.521 0.521 0.521 0.521 0.521 ...
  ..$ total.pct : num [1:62] 100 100 99.8 99.8 ...
  ..$ self.time : num [1:62] 0.006 0 0.001 0 0 0 0 0 ...
  ..$ self.pct : num [1:62] 1.15 0 0.19 0 0 0 0 0 ...
$ sample.interval: num 0.001
$ sampling.time : num 0.522
```

The summary reduces the information contained in the profile to marginal statistics per node. This is provided in two data frames giving the same information, only in different order.

The file contains several spurious recordings: nodes that have been recorded only few times. It is worth noting these, but then they better be discarded. We use a

time limit of 4ms, which given our sampling interval of 1ms means we require more than four observations.

	10.4	1.0		
	self.time	self.pct	total.time	total.pct
${ m "lm.fit"}$	0.087	16.670	0.113	21.650
"[.data.frame"	0.057	10.920	0.099	18.970
"model.matrix.default"	0.051	9.770	0.069	13.220
"as.character"	0.043	8.240	0.043	8.240
"lm"	0.042	8.050	0.474	90.800
"summary.lm"	0.040	7.660	0.045	8.620
"structure"	0.032	6.130	0.033	6.320
"na.omit.data.frame"	0.026	4.980	0.114	21.840
"anyDuplicated.default"	0.022	4.210	0.022	4.210
"as.list.data.frame"	0.022	4.210	0.022	4.210
			•	
< cut >	:	:	:	:
"FUN"	0.001	0.190	0.007	1.340
"%in%"	0.001	0.190	0.004	0.770
"deparse"	0.001	0.190	0.002	0.380
"\$"	0.001	0.190	0.001	0.190
"as.list.default"	0.001	0.190	0.001	0.190
"as.name"	0.001	0.190	0.001	0.190
"coef"	0.001	0.190	0.001	0.190
"file"	0.001	0.190	0.001	0.190
"NCOL"	0.001	0.190	0.001	0.190
"terms.formula"	0.001	0.190	0.001	0.190

Table 1: summaryRprof result: by.self as final stack entry, all records

	total.time	total.pct	self.time	self.pct
" <anonymous>"</anonymous>	0.522	100.000	0.006	1.150
"Sweave"	0.522	100.000	0.000	0.000
"eval"	0.521	99.810	0.001	0.190
"doTryCatch"	0.521	99.810	0.000	0.000
"evalFunc"	0.521	99.810	0.000	0.000
"try"	0.521	99.810	0.000	0.000
"tryCatch"	0.521	99.810	0.000	0.000
"tryCatchList"	0.521	99.810	0.000	0.000
"tryCatchOne"	0.521	99.810	0.000	0.000

"with Visible"	0.521	99.810	0.000	0.000
< cut >	:	:	:	:
"as.list"	0.023	4.410	0.000	0.000
"anyDuplicated.default"	0.022	4.210	0.022	4.210
"as.list.data.frame"	0.022	4.210	0.022	4.210
"sapply"	0.014	2.680	0.001	0.190
"match"	0.011	2.110	0.001	0.190
"[[.data.frame"	0.008	1.530	0.001	0.190
"[["	0.008	1.530	0.000	0.000
"rep.int"	0.007	1.340	0.007	1.340
"FUN"	0.007	1.340	0.001	0.190
"list"	0.005	0.960	0.005	0.960

Table 2: summaryRprof result: by.total, total time > 0.004s

1.1.2. Package sprof. In contrast, in our implementation we take a two step approach. First we read in the profile file to an internal representation.

```
sprof01lm <- readRprof("RprofsRegressionExpl01.out")
sprof01 <- sprof01lm</pre>
```

We keep this example and use the copy sprof01 of it extensively for illustration.

```
______ Input ______ save(sprof01lm, file="sprof01lm.RData")
```

To run the vignette with a different profile, replace ircodesprof01 by your example. You still have ircodesprof01lm for reference.

Package **sprof** provides a function **sampleRprof()** to take a sample and create a profile on the fly, as in

```
sprof01temp <- sampleRprof(runif(10000), runs=100)</pre>
```

The basic data structure consists of four data frames. The ircodeinfo section collects global infromation from the input file, such as an identification strings and various global matrix. The nodes section initially gives the same information marginal information as summaryRprof. The stacks section puts the node information into their calling context as found in the input profile file. The profiles section gives the temporal context. It is implemented as a list, but conceptually it is a data frame. Implementing it as a list allows run length encoding of variables, which unfortunately is not allowed by R in data frames.

```
str(sprof01, max.level=2, vec.len=3,nchar.max=40)
                                   Output
List of 4
$ info
           :'data.frame':
                                 1 obs. of 8 variables:
  ..$ id
              : Factor w/ 1 level "\"RprofsRegressionExpl01.out\" 2013-06-" | __truncated__: 1
              : POSIXct[1:1], format: "2013-07-09 23:03:29"
  ..$ nrnodes : int 62
  ..$ nrstacks : int 50
  ..$ nrrecords: int 522
  ..$ firstline: Factor w/ 1 level "sample.interval=1000": 1
  ..$ ctllines : Factor w/ 1 level "sample.interval=1000": 1
  ..$ ctllinenr: num 1
 $ nodes
          :'data.frame':
                                 62 obs. of 5 variables:
               : Factor w/ 62 levels "!","..getNamespace",..: 1 2 3 4 5 6 7 8 ...
  ..$ name
  ..$ self.time : num [1:62] 2 0 2 0 0 57 0 1 ...
  ..$ self.pct : num [1:62] 0.38 0 0.38 0 ...
  ..$ total.time: num [1:62] 2 1 4 26 99 99 8 8 ...
  ..$ total.pct : num [1:62] 0.03 0.01 0.05 0.34 1.29 1.29 0.1 0.1 ...
 $ stacks :'data.frame':
                                 50 obs. of 7 variables:
  ..$ nodes
                    :List of 50
                   : Factor w/ 50 levels "S<A>eFttCtCLtCOdTCwVeesleem.m..n.n..[["| __truncated__,..:
  ..$ shortname
```

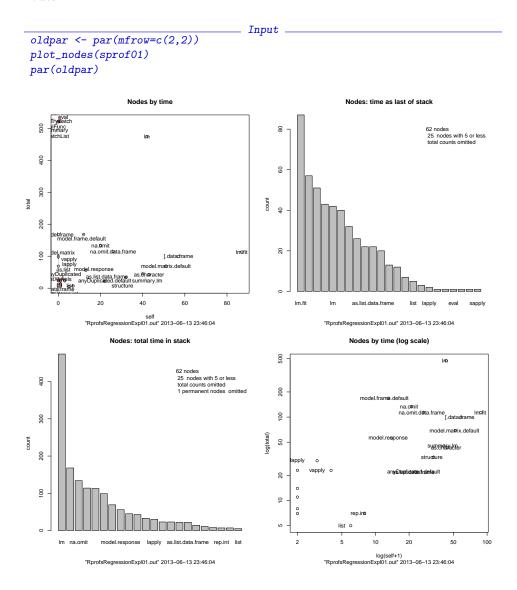
```
..$ refcount : num [1:50] 1 5 26 55 13 43 51 87 ...
..$ stacklength : int [1:50] 19 20 19 21 14 15 15 14 ...
..$ stackheadnodes: int [1:50] 52 52 52 52 52 52 52 52 ...
..$ stackleafnodes: int [1:50] 27 28 41 6 39 14 38 30 ...
..$ stacksrc : Factor w/ 50 levels "! [.data.frame [ na.omit.data.frame na."| __truncated__,..:
$ profiles:List of 4
..$ data : int [1:522] 1 2 2 3 4 4 5 5 ...
..$ mem : NULL
..$ malloc : NULL
..$ timesRLE:List of 2
...- attr(*, "class")= chr "rle"
- attr(*, "class")= chr [1:2] "sprof" "list"
```

The nodes do not come in a specific order. Access via a permutation vector is preferred. This allows different views on the same data set. For example, table 3 uses a permutation by total time, and a selection (compare to table 2 on page 7).

	name	self.time	self.pct	total.time	total.pct
10	<anonymous></anonymous>	6.000	1.150	522.000	6.790
52	Sweave	0.000	0.000	522.000	6.790
21	doTryCatch	0.000	0.000	521.000	6.780
22	eval	1.000	0.190	521.000	6.780
23	evalFunc	0.000	0.000	521.000	6.780
55	try	0.000	0.000	521.000	6.780
56	tryCatch	0.000	0.000	521.000	6.780
57	tryCatchList	0.000	0.000	521.000	6.780
58	tryCatchOne	0.000	0.000	521.000	6.780
62	withVisible	0.000	0.000	521.000	6.780
< cut >	\vdots	:	:	:	:
61	vapply	3.000	0.570	23.000	0.300
13	anyDuplicated.default	22.000	4.210	22.000	0.290
16	as.list.data.frame	22.000	4.210	22.000	0.290
47	sapply	1.000	0.190	14.000	0.180
31	match	1.000	0.190	11.000	0.140
7		0.000	0.000	8.000	0.100
8	.data.frame	1.000	0.190	8.000	0.100
25	FUN	1.000	0.190	7.000	0.090
46	rep.int	7.000	1.340	7.000	0.090
28	list	5.000	0.960	5.000	0.070

Table 3: splot result: by.total, total time > 0.004s

Common rearrangements as by total time and by self time are supplied by the display functions. Plot, for example, currently gives a choice of four displays for nodes.

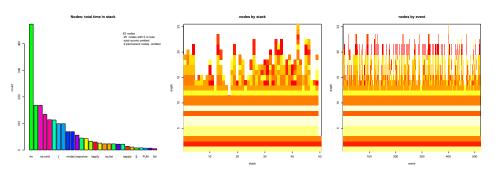


2. A BETTER GRIP ON PROFILE INFORMATION

The basic information provided by all profilers in R is a protocol of sampled stacks. The conventional approach is to break the information down to nodes and edges. The stacks provide more information than this. One way to access it is to use linking to pass information. To illustrate this, we encode the number the nodes by an arbitrary order and encode this by colour. Of course this is a poor information, and we use rainbow colours, which is about the poorest of all colour encodings. Just for demonstration.

This is what we get for free on our three levels: node, stack, and profile.

```
_ Input _
oldpar <- par(mfrow=c(1,3))</pre>
#colp <- rainbow(sprof01$info$nrnodes)</pre>
#plot_nodes # 3
xnodes <- sprof01$nodes</pre>
src <- sprof01$info$src</pre>
mincount <- 5
                  nrnodes <- dim(xnodes)[1]</pre>
                     totaltime <- sum(xnodes$self.time)</pre>
colp <- rainbow(nrnodes)</pre>
colp <- colp[order(xnodes$total.time,decreasing=TRUE)]</pre>
  xnodes$colp <- colp</pre>
                  xnodes <- xnodes[xnodes$total.time < totaltime,]</pre>
                   #browser()
                  if (mincount>0) xnodes <- xnodes[xnodes$total.time>=mincount,]
                   trimmed <- nrnodes-dim(xnodes)[1]</pre>
                   legnd <-function(trimmed=0, fulltime=0){</pre>
                                     ltext <- paste(nrnodes, "nodes\n")</pre>
                                     if \ (trimmed>0) \ ltext <- \ paste(ltext,trimmed," \ nodes \ with", mincount, "or \ less \ n \ total \ constraints \ description \ descript
                                     if (fulltime>0) ltext <- paste(ltext,fulltime,"permanent nodes omitted\n")</pre>
                                     legend("topright", legend=ltext, bty="n")
}
totaltime <- sum(xnodes$self.time)</pre>
                                                        fulltime <- dim(xnodes)[1]</pre>
                                                          xnodes <- xnodes[xnodes$total.time < totaltime,]</pre>
                                                         fulltime <- fulltime - dim(xnodes)[1]</pre>
                                                        ordertotal<- order(xnodes$total.time,decreasing=TRUE);</pre>
                                                        barplot(xnodes[ordertotal,]$total.time,
                                                        main="Nodes: total time in stack",
                                                        names.arg = xnodes[ordertotal,]$name, sub=src, ylab="count",
                                                         col=xnodes$colp);
                                                        legnd(trimmed=trimmed, fulltime=fulltime)
stacks_nodes <- list.as.matrix(sprof01$stacks$nodes)</pre>
#<<fig=TRUE, label=sREimgstacks>>=
image(x=1:ncol(stacks_nodes),y=1:nrow(stacks_nodes),
t(stacks_nodes),xlab="stack", ylab="depth", main="nodes by stack")
profile_nodes <- profiles_matrix(sprof01)</pre>
#<<fig=TRUE, label=sREimgprofiles>>=
image(x=1:ncol(profile_nodes),y=1:nrow(profile_nodes),
t(profile_nodes),xlab="event", ylab="depth", main="nodes by event")
par(oldpar)
```



The obvious message is that if seen by level, there are different structures. Profiling usually takes place in a framework. So at the base of the stacks, we find entries that are (almost) resistent. Then in general we have some few steps where the algorithm splits, and then we have the finer details. This can be identified on the stack level.

Not so often, but a frequent phenomenon is to have some "burn in" or "fade out". To identify this, we need to look at the profile level.

At a closer look, we may find stack patterns (maybe marked by specific nodes) that indicate administrative intervention and rather should be handled as aseparators between distinct profiles than as part of the general dynamics.

Stable framework effect can be detected automatically. "burn in" or "fade out' may need a closer look, and special stacks need and individual inspection on low frequency stacks.

Before starting additional inspection, the data better be trimmed. At this point, it is a decision whether to adapt the timing information, or keept the original information. Since this decision does affect the structural information, it is not critical. But analysis is easier if unused nodes are eliminated.

```
Input _______

sprof02 <- sprof01
basetrim <- 13
sprof02$stacks$nodes <- sapply(sprof02$stacks$nodes, function (x){if (length(x)> basetrim) x[-(1:baset.#sprof02$stacks$nodes <- sprof02$stacks$nodes[[!is.null(sprof02$stacks$nodes)]]

Input ______

oldpar <- par(mfrow=c(1,3))
#colp <- rainbow(sprof02$info$nrnodes)

#plot_nodes # 3
xnodes <- sprof02$nodes
src <- sprof02$info$src
```

```
if (mincount>0) xnodes <- xnodes[xnodes$total.time>=mincount,]
        trimmed <- nrnodes-dim(xnodes)[1]</pre>
        legnd <-function(trimmed=0, fulltime=0){</pre>
                 ltext <- paste(nrnodes, "nodes\n")</pre>
                 if (trimmed>0) ltext <- paste(ltext,trimmed," nodes with",mincount, "or less\n total co
                 if (fulltime>0) ltext <- paste(ltext,fulltime,"permanent nodes omitted\n")
                 legend("topright", legend=ltext, bty="n")
totaltime <- sum(xnodes$self.time)</pre>
                         fulltime <- dim(xnodes)[1]</pre>
                          xnodes <- xnodes[xnodes$total.time < totaltime,]</pre>
                          fulltime <- fulltime - dim(xnodes)[1]</pre>
                         ordertotal<- order(xnodes$total.time,decreasing=TRUE);</pre>
                         barplot(xnodes[ordertotal,]$total.time,
                         main="Nodes: total time in stack",
                         names.arg = xnodes[ordertotal,]$name, sub=src, ylab="count",
                         col=xnodes$colp);
                         legnd(trimmed=trimmed, fulltime=fulltime)
stacks_nodes <- list.as.matrix(sprof02$stacks$nodes)</pre>
#<<fig=TRUE, label=sREimgstacks>>=
image(x=1:ncol(stacks_nodes),y=1:nrow(stacks_nodes),
t(stacks_nodes),xlab="stack", ylab="depth", main="nodes by stack")
profile_nodes <- profiles_matrix(sprof02)</pre>
#<<fig=TRUE, label=sREimgprofiles>>=
image(x=1:ncol(profile_nodes),y=1:nrow(profile_nodes),
t(profile_nodes),xlab="event", ylab="depth", main="nodes by event")
par(oldpar)
```

For a visual inspection, runs of the same node and level in the profile are easily perceived. For an analytical inspection, we have to reconstruct the runs from the data. In stacks, runs are organized hierarchically. On the root level, runs are just ordinary runs. On the next levels, runs have to be defined given (within) the previous runs. So we need a recursive version of rle, applied to the profile information. This gives a detailed information about the presence time of each node, by stack level.

```
Input
profile_nodes_rle<- rrle(profile_nodes)
profile_nodes_rlet <- lapply(profile_nodes_rle, function(x) table(x,dnn=c("count","node")))
invisible(lapply(profile_nodes_rlet, function(x) print.table(x,zero.print = ".")))</pre>
```

```
node
count 2 4 11 19 22 30 32 37 39 43
   1 1 17 1 1 40 46 2 55 35 1
   2 . 1 . . 17 18 . 4 3 .
   3 . 1 . . 6 3 . 2 3 .
   4 . 1 . . 4 1 . . . .
   5 . . . . 2 1 . .
   6 . . . . 6 1 . . 1 .
       . . . 2 1 . .
   7.
   node
count 14 18 22 26 27 33 38 46 47 49 61
   1 34 1 40 16 1 2 55 7 3 10 .
   2 3 . 17 . . . 4 . . 1 .
   3 1 . 6 . . . 2 . . . 1
   4 . . 4 1 . . . . . . .
   5 . . 2 . . . . . . . .
   6 . . 6 . . . . . . 1 .
   7 . . 2 . . . . .
   node
count 5 7 9 15 26 31 35 48 61
  1 14 1 1 2 2 9 40 1 6
   2 \ . \ . \ . \ . \ . \ . \ 17 \ . \ 1
   3 . .
   5 . . . . . . 2 . .
   6 . . . . . . 6 . .
   7 . . . . . . 2 . .
   node
count 6 8 15 16 25 31 36 47 59
   1 14 1 7 2 1 1 40 9 1
   2 . . 1 . . . 17 . .
       . . . . . 6 . .
   4 1 . . . . . 4 . .
                . 2 .
   6 . . . . . . 6 .
   7 . . . . . . 2 . .
   node
count 3 10 12 16 17 20 22 26 40 47 48 49 53 60 61
  1 1 1 1 6 1 1 3 5 46 2 3 11 2 1 7
   2 . . . 1 . . 1 . 10 . . . . . .
   3 . . . . . . . . . . . . . . . . .
   4 . . . . . . . . 4 . . 1 . . .
   5 . . . . . . . . 1 . . . . . . 1
   6 . . . . . . . . . . . . . . . . .
   7.
                . . . 2 . . . . . .
   node
count 15 22 25 26 27 41 54 59
   1 7 3 5 3 1 43 1 3
   2 \ . \ 1 \ . \ . \ . \ 7 \ . \ .
   3 . . . . . 4 . .
   4 . . . . . 5 . .
   5 1 . . . . . . .
   6 . . . . . 3 . .
```

```
7
    node
count 3 5
           7 9 16 25 28
      3 46
            2 1
         3
         3
   5
   6
    node
count 6
         8 31 44 45
   1 46
           1
   2
      4
   3
      3
   4
      3
     1
    node
count 1 9 10 12 20 34 42
   121 . 9 1 1 2
             2
          1
            1
    node
count 9 13
   1 1 9
   4.2
   5 . 1
    node
count 31
   1 1
    node
count 34
   1 1
```

2.1. **The details.** For each recorded event, the protocol records one line with a text string showing the sampled stack (in reverse order: most recent first). The stack lines may be preceded by header lines with event specific information. The protocol may be interspersed with control information, such as information about the timing interval used.

We know that the structural information, static information as well as dynamic information, can be represented with the help of a graph. For a static analysis, the graph representation may be the first choice. For a dynamic analysis, the stack information is our first information. A stack is a connected path in the program graph. If we start with nodes and edges, we loose information which is readily available in record of stacks.

As we know that we are working with stacks, we know that they have their peculiarities. Stacks tend to grow and shrink. Subsequent events will have extensions and shrinkages of stacks (if the recording is on a fine scale), or stack sharing common stumps (if the recording is on a coarser scale).

ToDo: add current level
ToDo: generate a coplot representation
ToDo: add time per

call information

There have always been interrupts, and these show up in profiles. In R, this is related problem (GC)

The graph is a second instance that is (re)constructed from the stack recording.

Here is the way we represent the profile information:

The profile log file is sanitised:

- Control lines are extracted and recorded in a separate list.
- Head parts, if present, ere extracted and recorded in a matrix that is kept line-aligned with the remainder
- Line content is standardised, for example by removing stray quotation marks etc.

After this, the sanitised lines are encoded as a vector of stacks, and references to this.

If necessary, these steps are done by chunks to reduce memory load.

From the vector of stacks, a vector of nodes (or rather node names) is derived.

The stacks are now encoded by references to the nodes table. For convenience, we keep the (sanitised) textual representation of the stacks.

So far, texts are in reverse order. For each stack, we record the trailing leaf, and then we reverse order. The top of stack is now on first position.

Several statistics can be accumulated easily as a side effect.

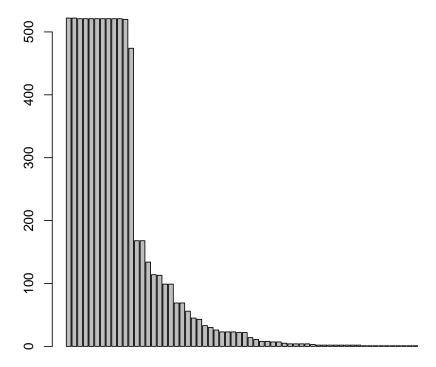
Conceptually, the data structure consist of three tables (the implementation may differ, and is subject to change).

The profiles table is the representation of the input file. Control lines are are collected in a special table. With the control lines removed, the rest is a table, one row per input line. The body of the line, the stack, is encoded as a reference to a stacks table (obligatory) and header information (optional).

The stacks table contains the collected stacks, each stack encoded as a list of references to the node table. This is obligatory. This list is kept in reverse order (root at position 1). A source line representing the stack information may be kept (optional).

The nodes table keeps the names at the nodes.

As a convention, we do not re-arrange items for ad-hoc choices, but use a permutation vector instead.



Selections are recorded as selection vectors, with reference to the original order. This needs some caution to align them with the order choices.

```
nodesnrobsok <- sprof01$nodes$total.time > 4

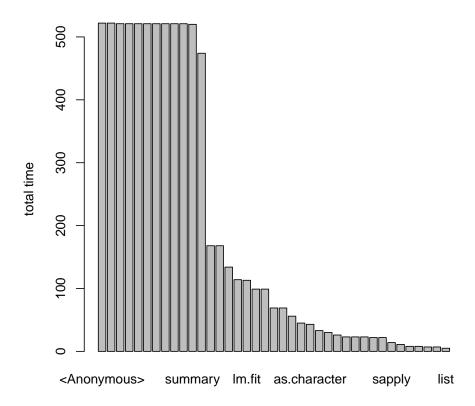
sp <- sprof01$nodes$total.time[nodesperm][nodesnrobsok[nodesperm]]

names(sp) <- sprof01$nodes$name[nodesperm][nodesnrobsok[nodesperm]]

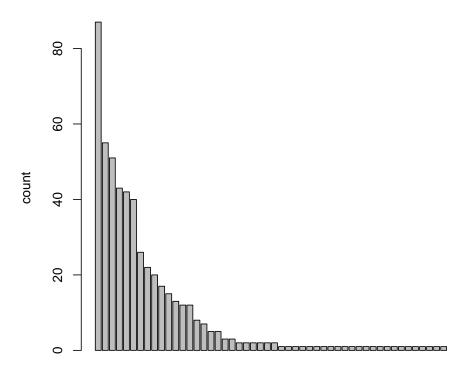
barplot(sp,

main="Nodes, by total time", ylab="total time")
```

Nodes, by total time

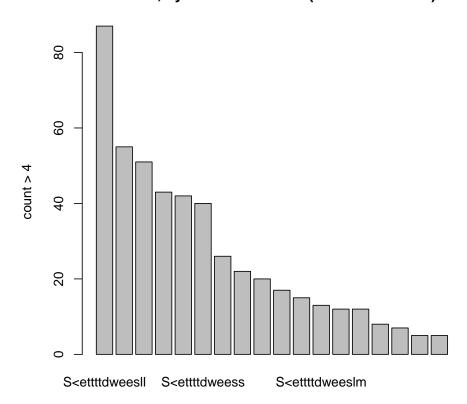


Stacks, by reference count

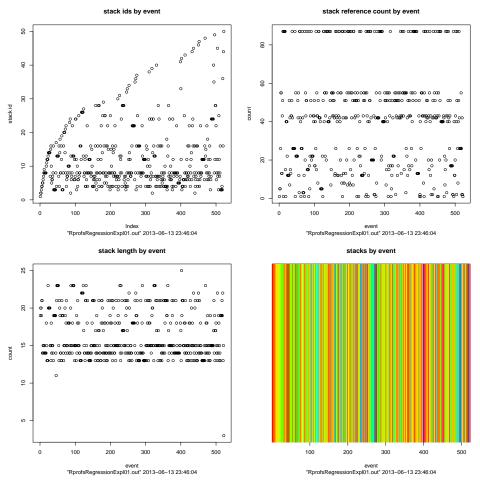


stacksnrobsok <- sprof01\$stacks\$refcount > 4
sp4 <- sprof01\$stacks\$refcount[stacksperm][stacksnrobsok[stacksperm]]
names(sp4) <- sprof01\$stacks\$shortname[stacksperm][stacksnrobsok[stacksperm]]
barplot(sp4,
main="Stacks, by reference count (4 obs. minimum)", ylab="count > 4")

Stacks, by reference count (4 obs. minimum)



On the first look, information on the profile level is not informative. Profile records are just recordings of some step, taken at regular intervals. We get a minimal information, if we encode the stacks in colour.



We now do a step down analysis. Aggregating the information from the profiling events, we have the frequency of stack references. On the stack level, we encode the frequency in colour, and linking propagates this to the profile level.

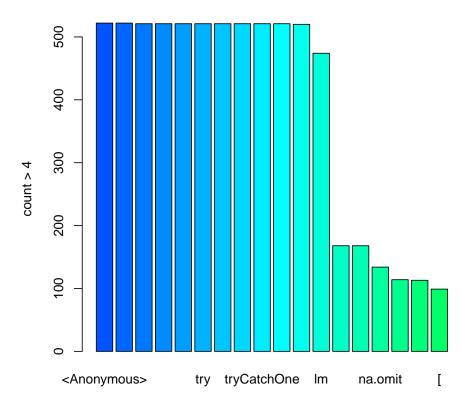
Input

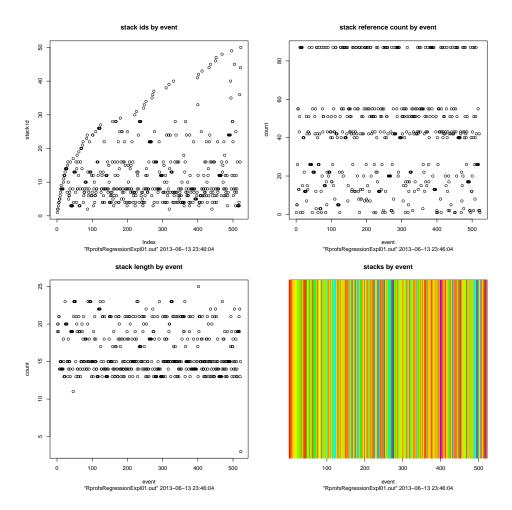
stackfreqscore <- rank(sprof01\stacks\refcount, ties.method="random")

stackfreqscore4<- stackfreqscore[stacksperm][stacksnrobsok[stacksperm]]

barplot(sp[stacksnrobsok[stacksperm]], main="Stacks, by reference count (4 obs. minimum)", ylab="count col=rainbow(80)[stackfreqscore4])

Stacks, by reference count (4 obs. minimum)





_____ Input ___

	name	self.time	self.pct	total.time	total.pct
1	!	2.000	0.380	2.000	0.030
2	get Name space	0.000	0.000	1.000	0.010
3	. departs = Opts	2.000	0.380	4.000	0.050
4	.getXlevels	0.000	0.000	26.000	0.340
5	[0.000	0.000	99.000	1.290
6	[.data.frame	57.000	10.920	99.000	1.290
7	[[0.000	0.000	8.000	0.100
8	[[.data.frame	1.000	0.190	8.000	0.100
9	$\% \mathrm{in}\%$	1.000	0.190	4.000	0.050
10	<anonymous></anonymous>	6.000	1.150	522.000	6.790
< cut >	$\setminus vdots$:	:	:	:
53	terms	0.000	0.000	2.000	0.030
54	terms.formula	1.000	0.190	1.000	0.010
55	try	0.000	0.000	521.000	6.780
56	tryCatch	0.000	0.000	521.000	6.780
57	tryCatchList	0.000	0.000	521.000	6.780
58	tryCatchOne	0.000	0.000	521.000	6.780
59	unique	3.000	0.570	4.000	0.050
60	unlist	0.000	0.000	1.000	0.010
61	vapply	3.000	0.570	23.000	0.300
62	withVisible	0.000	0.000	521.000	6.780

Table 4: nodes

```
_ Input _
str(sprof01$stacks, max.level=1)
                                  Output_-
                   50 obs. of 7 variables:
'data.frame':
               :List of 50
$ nodes
$ shortname
               : Factor w/ 50 levels "S<A>eFttCtCLtCOdTCwVeesleem.m..n.n...[[.",..: 27 17 19 1 35 36
$ refcount
               : num 1 5 26 55 13 43 51 87 1 15 ...
$ stacklength : int 19 20 19 21 14 15 15 14 15 18 ...
$ stackheadnodes: int 52 52 52 52 52 52 52 52 52 52 ...
$ stackleafnodes: int 27 28 41 6 39 14 38 30 27 49 ...
              : Factor w/ 50 levels "! [.data.frame [ na.omit.data.frame na.omit model.frame.default
                             _____ Input ___
                                   Input -
str(sprof01$profiles, max.level=1)
                                 _{-} Output _{-}
List of 4
$ data
          : int [1:522] 1 2 2 3 4 4 5 5 6 7 ...
$ mem
          : NULL
$ malloc : NULL
$ timesRLE:List of 2
 ..- attr(*, "class")= chr "rle"
                                ___ Input ____
A summary is provided on request.
                                   Input _
 sumsprof01 <- summary.sprof(sprof01)</pre>
str(sumsprof01, max.level=2)
                          _____ Output __
List of 4
$ info
          :'data.frame':
                            1 obs. of 8 variables:
              : Factor w/ 1 level "\"RprofsRegressionExpl01.out\" 2013-06-13 23:46:04": 1
              : POSIXct[1:1], format: "2013-07-09 23:03:29"
 ..$ nrnodes : int 62
  ..$ nrstacks : int 50
  ..$ nrrecords: int 522
  ..$ firstline: Factor w/ 1 level "sample.interval=1000": 1
  ..$ ctllines : Factor w/ 1 level "sample.interval=1000": 1
 ..$ ctllinenr: num 1
$ nodes :'data.frame':
                                62 obs. of 5 variables:
  ..$ name : Factor w/ 62 levels "!","..getNamespace",..: 1 2 3 4 5 6 7 8 9 10 ...
  ..$ self.time : num [1:62] 2 0 2 0 0 57 0 1 1 6 ...
 ..$ self.pct : num [1:62] 0.38 0 0.38 0 0 ...
 ..$ total.time: num [1:62] 2 1 4 26 99 99 8 8 4 522 ...
 ..$ total.pct : num [1:62] 0.03 0.01 0.05 0.34 1.29 1.29 0.1 0.1 0.05 6.79 ...
$ stacks :'data.frame':
                              50 obs. of 7 variables:
```

```
..$ nodes
                   :List of 50
 ..$ shortname
                   : Factor w/ 50 levels "S<A>eFttCtCLtCOdTCwVeesleem.m..n.n...[[.",..: 27 17 19 1 35
 ..$ refcount
                   : num [1:50] 1 5 26 55 13 43 51 87 1 15 ...
 ..$ stacklength : int [1:50] 19 20 19 21 14 15 15 14 15 18 ...
 ..$ stackheadnodes: int [1:50] 52 52 52 52 52 52 52 52 52 ...
 ..$ stackleafnodes: int [1:50] 27 28 41 6 39 14 38 30 27 49 ...
                  : Factor w/ 50 levels "! [.data.frame [ na.omit.data.frame na.omit model.frame.defa
 ..$ stackssrc
$ profiles:List of 4
 ..$ data
            : int [1:522] 1 2 2 3 4 4 5 5 6 7 ...
 ..$ mem
             : NULL
 .. $ malloc : NULL
 ..$ timesRLE:List of 2
.. ..- attr(*, "class")= chr "rle"
- attr(*, "class")= chr [1:2] "sprof" "list"
```

The classical approach hides the work that has been done. Actually it breaks down the data to record items. This figure is not reported anywhere. In our case, it can be reconstructed. The profile data have 8456 words in 524 lines.

In our approach, we break down the information. Two lines of control information are split off. We have 522 lines of profile with 50 unique stacks, referencing 62 nodes. Instead of reducing it to a summary, we keep the full information. Information is always kept on its original level.

On the profiles level, we know the sample interval length, and the id of the stack recorded. On the stack level, for each stack we have a reference count, with the sample interval lengths used as weights. This reference count is added up for each node in the stack to give the node timings.

Cheap statistics are collected as the come by. For example, from the stacks table it is cheap to identify root and leaf nodes, and this mark is propagated to the nodes table.

4. Surgery

Looking at nodes gives you a pointwise horizon. Looking at edges gives you a one step horizon. The stacks give a wider horizon, typically a step size of 10 or more. The stacks we get from R have peculiarities, and we can handle with this broader perspective. These are not relevant if we look pointwise, but may become dominating if we try to get a global picture. We take a look ahead (details to come in section 7 on page 48 and nave a preview how our example is represented as a graph. Left is the original graph es recovered from the edge information, right the graph after we have cut off the scaffold effects.

4.1. graph Package.

```
oldpar <- par(mfrow=c(1,2))
library(graph)
plot(as(adjacency(sprof01), "graphNEL"), plot(as(adjacency(sprof02), "graphNEL"), main="graph layout sprof02", cex.main=2)
par(oldpar)

graph layout sprof02

graph layout sprof02
```

R ist function based, and control structures in general are implemented as functions. In a graph representation, they appear as nodes, concentrating and seeding to unrelated paths. We can detect these on the stack level and replace them by surrogates, introducing new nodes.

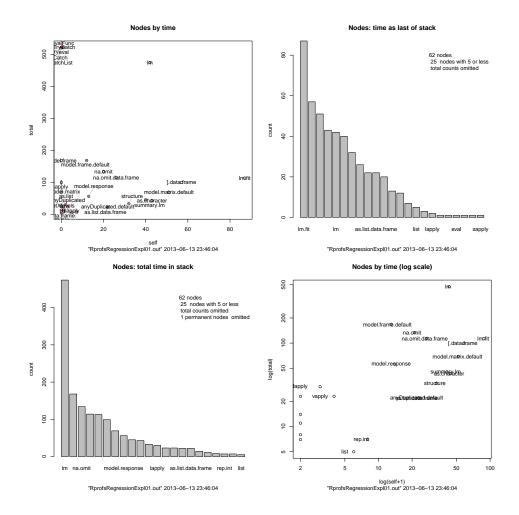
 $\underline{\textbf{ToDo:}} \text{ implement}$

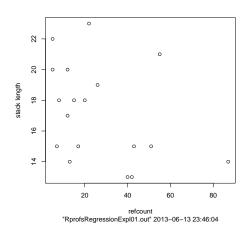
```
newchopnode <- function(nodenames, chop) {
tmpname <- paste("<",as.character(nodenames[chop]),">")
# chec for existing.
# add if necessary
tmpname
}
chopstack <- function(x , chop, replacement)
{
# is chop in x`
# y: cut x.
# merge x <- head + replacement + tiail
return(x)
}</pre>
```

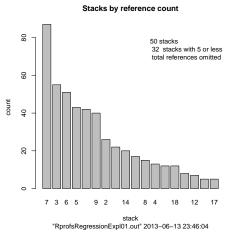
5. YYY

5.0.1. *Plot.* Looking at lists of numbers is not too informative. We get a first impression by plotting the data.

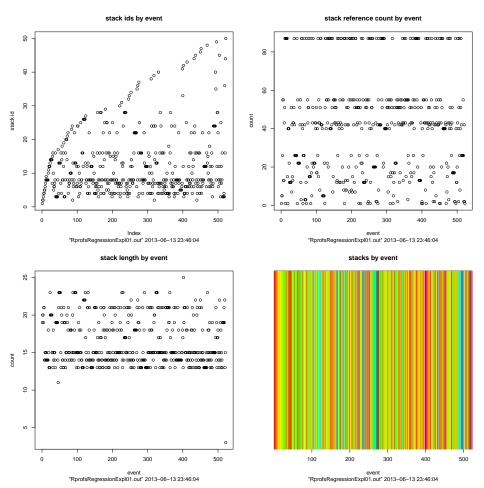
#plot_nodes(sprof01, col=nodescol[nodescore])
oldpar <- par(mfrow=c(2,2))
plot_nodes(sprof01)
par(oldpar)</pre>







Input -



The plot() method for sprof objects concatenates these three functions.

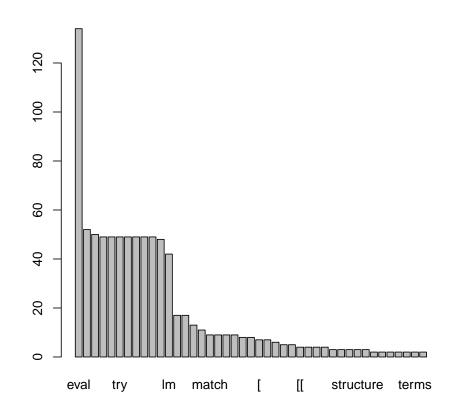
5.1. analysis.

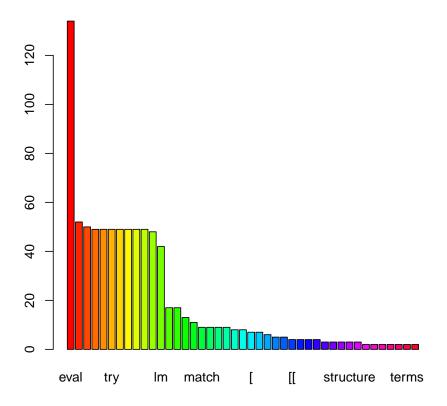
```
Input
profile_nodes_rrle <- rrle(profile_nodes)
str(profile_nodes_rrle)

Output

List of 12
$ :List of 2
..$ lengths: int [1:361] 6 3 1 7 1 1 1 1 1 1 6 ...
..$ values : int [1:361] 22 39 37 30 4 2 NA NA NA 22 ...
..- attr(*, "class")= chr "rle"
$ :List of 2
..$ lengths: int [1:407] 6 1 1 1 1 1 1 1 1 1 1 ...
..$ values : int [1:407] 22 NA NA 14 38 NA 27 NA NA NA ...
..- attr(*, "class")= chr "rle"
$ :List of 2
..$ lengths: int [1:427] 6 1 1 1 1 1 1 1 1 1 ...
```

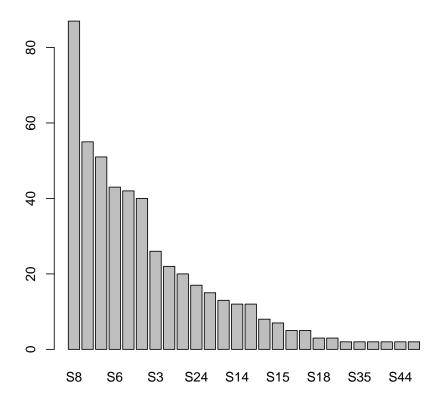
```
...$ values : int [1:427] 35 NA NA NA NA NA NA NA NA NA ...
 ..- attr(*, "class")= chr "rle"
$ :List of 2
  ..$ lengths: int [1:427] 6 1 1 1 1 1 1 1 1 1 ...
 ..$ values : int [1:427] 36 NA ...
  ..- attr(*, "class")= chr "rle"
$:List of 2
  ..$ lengths: int [1:450] 1 2 3 1 1 1 1 1 1 1 ...
  ..$ values : int [1:450] 53 22 40 NA NA NA NA NA NA NA ...
  ..- attr(*, "class")= chr "rle"
$ :List of 2
 ..$ lengths: int [1:466] 1 2 3 1 1 1 1 1 1 1 ...
 ..$ values : int [1:466] 27 22 41 NA NA NA NA NA NA NA ...
  ..- attr(*, "class")= chr "rle"
$ :List of 2
  ..$ lengths: int [1:489] 1 2 1 2 1 1 1 1 1 1 ...
 ..$ values : int [1:489] NA 28 NA 5 NA NA NA NA NA NA ...
  ..- attr(*, "class")= chr "rle"
$ :List of 2
  ..$ lengths: int [1:494] 1 1 1 1 2 1 1 1 1 1 ...
  ...$ values : int [1:494] NA NA NA NA O NA NA NA NA NA ...
 ..- attr(*, "class")= chr "rle"
$ :List of 2
  ..$ lengths: int [1:508] 1 1 1 1 1 1 1 1 1 1 ...
  ..$ values : int [1:508] NA ...
 ..- attr(*, "class")= chr "rle"
$ :List of 2
 ..$ lengths: int [1:512] 1 1 1 1 1 1 1 1 1 ...
 ..$ values : int [1:512] NA ...
 ..- attr(*, "class")= chr "rle"
$ :List of 2
  ..$ lengths: int [1:522] 1 1 1 1 1 1 1 1 1 1 ...
 ..$ values : int [1:522] NA ...
  ..- attr(*, "class")= chr "rle"
$ :List of 2
 ..$ lengths: int [1:522] 1 1 1 1 1 1 1 1 1 1 ...
  ..$ values : int [1:522] NA ...
  ..- attr(*, "class")= chr "rle"
5.2. trimming.
trimstacks <- function(sprof, level){</pre>
lapply(sprof$stacks$nodes, function(x) {x[-(1:level)]})
 sprof01Tr <- trimstacks(sprof01, 11)</pre>
 #profile_nodesTr <- profiles_matrix(sprof01Tr)</pre>
 #image(x=1:ncol(profile_nodesTr),y=1:nrow(profile_nodesTr), t(profile_nodesTr),xlab="event", ylab="dep
```

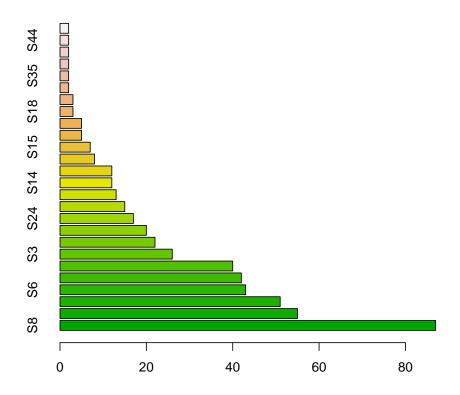


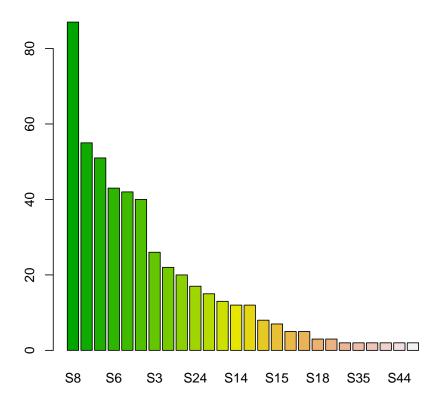


Top frequent stacks.

```
x <- sprof01
xsrc <- as.matrix(x$stacks$refcount)
rownames(xsrc) <- rownames(xsrc, do.NULL=FALSE, prefix="S")
#stf <- x$stacks$refcount[x$stacks$refcount>1]
#names(stf) <- x$stacks$shortname[x$stacks$refcount>1]
stf <- xsrc[xsrc>1]
names(stf) <- rownames(xsrc)[xsrc>1]
ostf <- order(stf,decreasing=TRUE)
barplot(stf[ostf])</pre>
```







There is no statistics on profiles. Profiling are our elementary data. However we can link to our derived data to get a more informative display. For example, going one step back we can encode stacks and use these colour codes in the display of a profile.

Or going two steps back, we can encode nodes in colour, giving coloured stacks, and use these in the display of profile data.

6. STANDARD OUTPUT sprof <- sprof01 6.1. Summary. Input summary_nodes(sprof)

		0	utput	7.6	7.6	
					-	total.time
!	N	_	LEAF	2	Inf	0
getNamespace	gN	_	TEAE	0	NaN	0
.deparseOpts	.dpO	_	LEAF	2	Inf	0
.getXlevels	.gtX	-	-	0	NaN	0
	[-	-	0	NaN	0
L.data.frame	[.d.	-	LEAF	57	Inf	0
	[[-	-	0	NaN	0
[[.data.frame	[[LEAF	1	Inf	0
%in%	%in%		LEAF	1	Inf	0
<anonymous></anonymous>	<an></an>		LEAF	6	Inf	0
\$	\$		LEAF	1	Inf	0
anyDuplicated	anyD		LEAF	1	Inf	0
anyDuplicated.default	anD.		LEAF	22	Inf	0
as.character	as.c	-	LEAF	43	Inf	0
as.list	as.l	-	-	0	NaN	0
as.list.data.frame	a		LEAF	22	Inf	0
as.list.default	as		LEAF	1	Inf	0
as.name	as.n		LEAF	1	Inf	0
coef	coef		LEAF	1	Inf	0
deparse	dprs	-	LEAF	1	Inf	0
doTryCatch	dTrC	-	-	0	NaN	0
eval	eval	-	LEAF	1	Inf	0
evalFunc	evlF	-	-	0	NaN	0
file	file		LEAF	1	Inf	0
FUN	FUN	-	LEAF	1	Inf	0
lapply	lppl	-	LEAF	2	Inf	0
lazyLoadDBfetch	1LDB	-	LEAF	2	Inf	0
list	list	-	LEAF	5	Inf	0
lm	lm	-	LEAF	42	Inf	0
lm.fit	lm.f		LEAF	87	Inf	0
match	mtch	-	LEAF	1	Inf	0
mean	mean	-	-	0	NaN	0
mean.default	mn.d	-	LEAF	2	Inf	0
mode	mode	-	LEAF	2	Inf	0
model.frame	mdl.f	-	-	0	NaN	0
model.frame.default	mdl.f.	-	LEAF	12	Inf	0
model.matrix	mdl.m	-	-	0	NaN	0
model.matrix.default	${\tt mdl.m.}$	-	LEAF	51	Inf	0
model.response	mdl.r	-	LEAF	13	Inf	0
na.omit	n.mt	-	LEAF	20	Inf	0
na.omit.data.frame	n	-	LEAF	26	Inf	0
names	nams	-	LEAF	2	Inf	0
NCOL	NCOL	-	LEAF	1	Inf	0
paste	past	-	-	0	NaN	0
pmatch	pmtc	-	LEAF	2	Inf	0
rep.int	rp.n	-	LEAF	7	Inf	0
sapply	sppl	-	LEAF	1	Inf	0
simplify2array	smp2	-	-	0	NaN	0
structure	strc	-	LEAF	32	Inf	0
summary	smmr	-	-	0	NaN	0
summary.lm	smm.	-	LEAF	40	Inf	0

a	σ.	роош		•	37 37	0
Sweave		ROOT	-	0	NaN NaN	0
terms	trms	_	-	0	NaN	0
terms.formula	trm.		LEAF	1	Inf	0
try	try	-	-	0	NaN N-N	0
tryCatch	tryC	-	-	0	NaN	0
tryCatchList	trCL	-	-	0	NaN	0
tryCatchOne	trCO	-	-	0	NaN	0
unique	uniq	_	LEAF	3	Inf	0
unlist	unls	_	-	0	NaN	0
vapply	vppl	_	LEAF	3	Inf	0
withVisible	wthV	-	-	0	NaN	0
	total.pct					
!	NaN					
getNamespace	NaN					
.deparseOpts	NaN					
.getXlevels	NaN					
[NaN					
[.data.frame	NaN					
[[NaN					
[[.data.frame	NaN					
%in%	NaN					
<anonymous></anonymous>	NaN					
\$	NaN					
anyDuplicated	NaN					
anyDuplicated.default	NaN					
as.character	NaN					
as.list	NaN					
as.list.data.frame	NaN					
as.list.default	NaN					
as.name	NaN					
coef	NaN					
deparse	NaN					
doTryCatch	NaN N-N					
eval	NaN					
evalFunc	NaN					
file	NaN					
FUN	NaN N-N					
lapply	NaN N-N					
lazyLoadDBfetch	NaN N-N					
list	NaN N-N					
lm	NaN					
lm.fit	NaN NaN					
match	NaN					
mean mean.default	NaN NaN					
mode model.frame	NaN NaN					
model.frame.default model.matrix	NaN NaN					
model.matrix.default	NaN NaN					
	NaN NaN					
model.response na.omit	NaN NaN					
na.omit.data.frame	NaN NaN					
na.umit.uata.IIame	IVAIN					

NaN names NCOL NaN paste NaN pmatchNaN rep.int NaN NaN sapply NaN simplify2array structure NaN summary NaN NaN summary.lm Sweave NaN terms NaN NaN terms.formula NaN try tryCatch NaN tryCatchListNaN tryCatchOne NaN unique NaN unlist NaN NaN vapply withVisible NaN

summary_stacks(sprof)

_ Input _

	len	refcount	root	leafs
1	19	1	52	27
2	20	5	52	28
3	19	26	52	41
4	21	55	52	6
5	14	13	52	39
6	15	43	52	14
7	15	51	52	38
8	14	87	52	30
9	15	1	52	27
10	18	15	52	49
11	15	1	52	18
12	13	40	52	51
13	23	22	52	13
14	20	12	52	16
15	15	7	52	46
16	13	42	52	29
17	11	1	52	22
18	19	3	52	59
19	21	1	52	8
20	15	3	52	61
21	19	1	52	25
22	18	20	52	40
23	14	1	52	11
24	15	17	52	49
25	18	8	52	16
26	22	5	52	10

__ Output _

```
27 17
          1
              52
                  47
28 17
          12
              52
                  36
29 17
              52
                  31
30 18
              52
                  3
          1
                 12
31 18
              52
          1
32 20
              52
                  3
          1
          2
              52
                 16
33 17
          1
              52
                  9
34 22
          2
              52
35 21
                  45
36 22
          2
              52
                   1
37 19
          1
              52
                  54
38 18
          1
             52
                  10
39 19
              52
                  26
          1
40 17
          2 52
                 6
41 18
          1 52
                 17
42 25
          1 52
43 18
          1 52 20
          2 52 33
44 15
45 22
          2 52 42
                 34
46 22
             52
          1
47 14
                 43
          1
             52
             52
                 19
48 14
          1
49 19
          1
              52
                  26
50 3
          1
```

```
summary_profiles(sprof)

Output

$id
[1] "Profile Summary Tue Jul 9 23:03:38 2013"

$len
[1] 522

$uniquestacks
[1] 50

$nr_runs
```

The summary() method for sprof objects concatenates these three functions.

6.2. **Print.**

[1] 396

print_nodes(sprof)]	Input			
	shortname		utput leaf		self nct	total.time
!	i i		LEAF	2	Inf	0
getNamespace	gN	-	-	0	NaN	0
.deparseOpts	.dpO	_	LEAF	2	Inf	0

.getXlevels	.gtX	-	-	0	NaN	0
	[-	-	0	NaN	0
[.data.frame	[.d.	-	LEAF	57	Inf	0
11]]	-	-	0	NaN	0
[[.data.frame	[[-	LEAF	1	Inf	0
%in%	%in%	-	LEAF	1	Inf	0
<anonymous></anonymous>	<an></an>	-	LEAF	6	Inf	0
\$	\$	-	LEAF	1	Inf	0
anyDuplicated	anyD	-	LEAF	1	Inf	0
anyDuplicated.default	anD.	-	LEAF	22	Inf	0
as.character	as.c	-	LEAF	43	Inf	0
as.list	as.l	-	-	0	NaN	0
as.list.data.frame	a	-	LEAF	22	Inf	0
as.list.default	as	-	LEAF	1	Inf	0
as.name	as.n	_	LEAF	1	Inf	0
coef	coef	_	LEAF	1	Inf	0
deparse	dprs	_	LEAF	1	Inf	0
doTryCatch	dTrC	_	_	0	NaN	0
eval	eval	_	LEAF	1	Inf	0
evalFunc	evlF	_	_	0	NaN	0
file	file	_	LEAF	1	Inf	0
FUN	FUN		LEAF	1	Inf	0
lapply	lppl		LEAF	2	Inf	0
lazyLoadDBfetch	1LDB		LEAF	2	Inf	0
list	list		LEAF	5	Inf	0
lm	lm		LEAF	42	Inf	0
lm.fit	lm.f		LEAF	87	Inf	0
match	mtch		LEAF	1	Inf	0
mean	mean	_		0	NaN	0
mean.default	mn.d	_	LEAF	2	Inf	0
mode	mode		LEAF	2	Inf	0
model.frame	mdl.f	_		0	NaN	0
model.frame.default	mdl.f.	_	LEAF	12	Inf	0
model.matrix	mdl.m	_		0	NaN	0
model.matrix.default	mdl.m.	_	LEAF	51	Inf	0
model.response	mdl.r		LEAF	13	Inf	0
na.omit	n.mt		LEAF	20	Inf	0
na.omit.data.frame	n		LEAF	26	Inf	0
	nams		LEAF	20	Inf	0
names NCOL	NCOL		LEAF	1	Inf	0
			LEAF	0	NaN	0
paste	past		LEAF	2		0
pmatch rep.int	pmtc		LEAF	7	Inf Inf	0
-	rp.n		LEAF			0
sapply	sppl		LEAF	1	Inf	
simplify2array	smp2		TEAE	0	NaN	0
structure	strc	_	LEAF	32	Inf	0
summary	smmr	_	TEAE	0	NaN	0
summary.lm	smm.		LEAF	40	Inf	0
Sweave		ROOT	_	0	NaN	0
terms	trms	-	TEAR	0	NaN	0
terms.formula	trm.	-	LEAF	1	Inf	0
try	try	_	_	0	NaN N-N	0
tryCatch	tryC	_	_	0	NaN	0

tryCatchList	trCL		0	NaN	0
tryCatchOne	trCO		0	NaN	0
unique	uniq	- LEAF	3	Inf	0
unlist	unls		0	NaN	0
vapply	vppl wthV	- LEAF	3	Inf	0
withVisible			0	NaN	0
į.	total.pct				
•	NaN NaN				
getNamespace	NaN NaN				
.deparseOpts	NaN NaN				
.getXlevels [NaN				
[.data.frame	NaN				
[[NaN				
[[.data.frame	NaN				
%in%	NaN				
<anonymous></anonymous>	NaN				
\$	NaN				
anyDuplicated	NaN				
anyDuplicated.default	NaN				
as.character	NaN				
as.list	NaN				
as.list.data.frame	NaN				
as.list.default	NaN				
as.name	NaN				
coef	NaN				
deparse	NaN				
doTryCatch	NaN				
eval	NaN				
evalFunc	NaN				
file	NaN				
FUN	NaN				
lapply	NaN				
${\tt lazyLoadDBfetch}$	NaN				
list	NaN				
lm	NaN				
lm.fit	NaN				
match	NaN				
mean	NaN				
mean.default	NaN				
mode	NaN				
model.frame	NaN				
model.frame.default	NaN				
model.matrix	NaN				
model.matrix.default	NaN				
model.response	NaN NaN				
na.omit	NaN NaN				
na.omit.data.frame	NaN NaN				
names	NaN NaN				
NCOL	NaN NaN				
paste	NaN NaN				
pmatch	NaN NaN				
rep.int	IV a.IV				

sapply	${\tt NaN}$
simplify2array	${\tt NaN}$
structure	${\tt NaN}$
summary	NaN
summary.lm	${\tt NaN}$
Sweave	${\tt NaN}$
terms	${\tt NaN}$
terms.formula	NaN
try	NaN
tryCatch	${\tt NaN}$
tryCatchList	${\tt NaN}$
tryCatchOne	${\tt NaN}$
unique	NaN
unlist	NaN
vapply	NaN
withVisible	NaN

print_stacks(sprof)

len refcount root leafs 1
2 20 5 52 28 3 19 26 52 41 4 21 55 52 6 5 14 13 52 39 6 15 43 52 14 7 15 51 52 38 8 14 87 52 30 9 15 1 52 27 10 18 15 52 49 11 15 1 52 18 12 13 40 52 51 13 23 22 52 13 14 20 12 52 16 15 15 7 52 46 16 13 42 52 29 17 11 1 52 22 18 19 3 52 59 19 21 1 52 8 20 15 3 52 <td< td=""></td<>
3 19 26 52 41 4 21 55 52 6 5 14 13 52 39 6 15 43 52 14 7 15 51 52 38 8 14 87 52 30 9 15 1 52 27 10 18 15 52 49 11 15 1 52 18 12 13 40 52 51 13 23 22 52 13 14 20 12 52 16 15 15 7 52 46 16 13 42 52 29 17 11 1 52 22 18 19 3 52 59 19 21 1 52 8 20 15 3 52 61 21 19 1 52 <t< td=""></t<>
4 21 55 52 6 5 14 13 52 39 6 15 43 52 14 7 15 51 52 38 8 14 87 52 30 9 15 1 52 27 10 18 15 52 49 11 15 1 52 18 12 13 40 52 51 13 23 22 52 13 14 20 12 52 16 15 15 7 52 46 16 13 42 52 29 17 11 1 52 22 18 19 3 52 59 19 21 1 52 8 20 15 3 52 61 21 19 1 52 25 22 18 20 52 <
5 14 13 52 39 6 15 43 52 14 7 15 51 52 38 8 14 87 52 30 9 15 1 52 27 10 18 15 52 49 11 15 1 52 18 12 13 40 52 51 13 23 22 52 13 14 20 12 52 16 15 15 7 52 46 16 13 42 52 29 17 11 1 52 22 18 19 3 52 59 19 21 1 52 8 20 15 3 52 61 21 19 1 52 25 22 18 20 52 40 23 14 1 52
6 15 43 52 14 7 15 51 52 38 8 14 87 52 30 9 15 1 52 27 10 18 15 52 49 11 15 1 52 18 12 13 40 52 51 13 23 22 52 13 14 20 12 52 16 15 15 7 52 46 16 13 42 52 29 17 11 1 52 22 18 19 3 52 59 19 21 1 52 8 20 15 3 52 61 21 19 1 52 25 22 18 20 52 40 23 14 1 52 11 24 15 17 52 49 25 18 8 52 16
7 15 51 52 38 8 14 87 52 30 9 15 1 52 27 10 18 15 52 49 11 15 1 52 18 12 13 40 52 51 13 23 22 52 13 14 20 12 52 16 15 15 7 52 46 16 13 42 52 29 17 11 1 52 22 18 19 3 52 59 19 21 1 52 8 20 15 3 52 61 21 19 1 52 25 22 18 20 52 40 23 14 1 52 11 24 15 17 52 49 25 18 8 52
8 14 87 52 30 9 15 1 52 27 10 18 15 52 49 11 15 1 52 18 12 13 40 52 51 13 23 22 52 13 14 20 12 52 16 15 15 7 52 46 16 13 42 52 29 17 11 1 52 22 18 19 3 52 59 19 21 1 52 8 20 15 3 52 61 21 19 1 52 25 22 18 20 52 40 23 14 1 52 11 24 15 17 52 49 25 18 8 52 16
9 15 1 52 27 10 18 15 52 49 11 15 1 52 18 12 13 40 52 51 13 23 22 52 13 14 20 12 52 16 15 15 7 52 46 16 13 42 52 29 17 11 1 52 22 18 19 3 52 59 19 21 1 52 8 20 15 3 52 61 21 19 1 52 25 22 18 20 52 40 23 14 1 52 11 24 15 17 52 49 25 18 8 52 16
10 18 15 52 49 11 15 1 52 18 12 13 40 52 51 13 23 22 52 13 14 20 12 52 16 15 15 7 52 46 16 13 42 52 29 17 11 1 52 22 18 19 3 52 59 19 21 1 52 8 20 15 3 52 61 21 19 1 52 25 22 18 20 52 40 23 14 1 52 11 24 15 17 52 49 25 18 8 52 16
11 15 1 52 18 12 13 40 52 51 13 23 22 52 13 14 20 12 52 16 15 15 7 52 46 16 13 42 52 29 17 11 1 52 22 18 19 3 52 59 19 21 1 52 8 20 15 3 52 61 21 19 1 52 25 22 18 20 52 40 23 14 1 52 11 24 15 17 52 49 25 18 8 52 16
12 13 40 52 51 13 23 22 52 13 14 20 12 52 16 15 15 7 52 46 16 13 42 52 29 17 11 1 52 22 18 19 3 52 59 19 21 1 52 8 20 15 3 52 61 21 19 1 52 25 22 18 20 52 40 23 14 1 52 11 24 15 17 52 49 25 18 8 52 16
13 23 22 52 13 14 20 12 52 16 15 15 7 52 46 16 13 42 52 29 17 11 1 52 22 18 19 3 52 59 19 21 1 52 8 20 15 3 52 61 21 19 1 52 25 22 18 20 52 40 23 14 1 52 11 24 15 17 52 49 25 18 8 52 16
14 20 12 52 16 15 15 7 52 46 16 13 42 52 29 17 11 1 52 22 18 19 3 52 59 19 21 1 52 8 20 15 3 52 61 21 19 1 52 25 22 18 20 52 40 23 14 1 52 11 24 15 17 52 49 25 18 8 52 16
15 15 7 52 46 16 13 42 52 29 17 11 1 52 22 18 19 3 52 59 19 21 1 52 8 20 15 3 52 61 21 19 1 52 25 22 18 20 52 40 23 14 1 52 11 24 15 17 52 49 25 18 8 52 16
16 13 42 52 29 17 11 1 52 22 18 19 3 52 59 19 21 1 52 8 20 15 3 52 61 21 19 1 52 25 22 18 20 52 40 23 14 1 52 11 24 15 17 52 49 25 18 8 52 16
17 11 1 52 22 18 19 3 52 59 19 21 1 52 8 20 15 3 52 61 21 19 1 52 25 22 18 20 52 40 23 14 1 52 11 24 15 17 52 49 25 18 8 52 16
18 19 3 52 59 19 21 1 52 8 20 15 3 52 61 21 19 1 52 25 22 18 20 52 40 23 14 1 52 11 24 15 17 52 49 25 18 8 52 16
18 19 3 52 59 19 21 1 52 8 20 15 3 52 61 21 19 1 52 25 22 18 20 52 40 23 14 1 52 11 24 15 17 52 49 25 18 8 52 16
19 21 1 52 8 20 15 3 52 61 21 19 1 52 25 22 18 20 52 40 23 14 1 52 11 24 15 17 52 49 25 18 8 52 16
21 19 1 52 25 22 18 20 52 40 23 14 1 52 11 24 15 17 52 49 25 18 8 52 16
21 19 1 52 25 22 18 20 52 40 23 14 1 52 11 24 15 17 52 49 25 18 8 52 16
22 18 20 52 40 23 14 1 52 11 24 15 17 52 49 25 18 8 52 16
24 15 17 52 49 25 18 8 52 16
24 15 17 52 49 25 18 8 52 16
25 18 8 52 16
27 17 1 52 47
28 17 12 52 36
29 17 1 52 31
30 18 1 52 3
31 18 1 52 12

```
32 20
            1
               52
                     3
33 17
            2
               52
                     16
34 22
               52
                     9
35 21
            2
               52
                     45
            2
36 22
               52
                     1
37 19
                     54
               52
            1
38 18
               52
                     10
            1
            1
               52
                     26
39 19
            2
               52
40 17
                     6
41 18
            1
               52
                     17
42 25
            1
               52
                     34
43 18
            1
               52
                     20
44 15
            2
               52
                     33
            2 52
45 22
                     42
46 22
            1
               52
                     34
47 14
            1 52
                     43
48 14
            1 52
                   19
            1 52
49 19
                     26
50 3
            1 52
                     24
```

```
______ Input ______
print_profiles(sprof)
```

______ Output _____

\$id

[1] "Profile Summary Tue Jul 9 23:03:39 2013" $\,$

\$len

[1] 522

\$uniquestacks

[1] 50

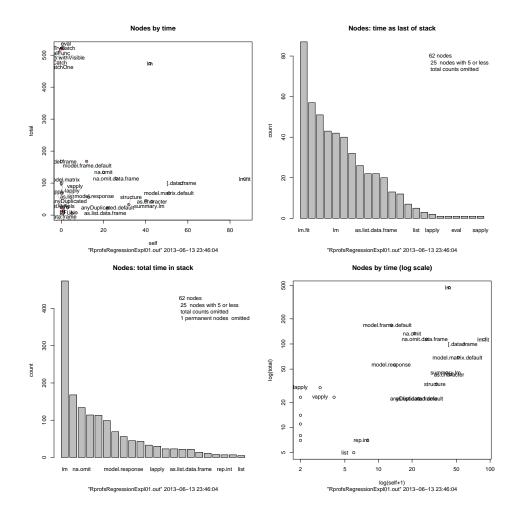
\$nr_runs

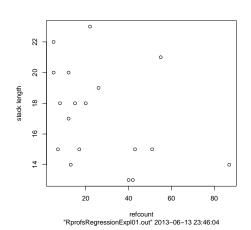
[1] 396

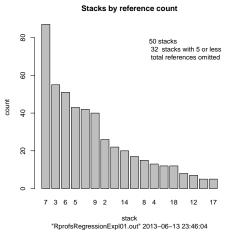
The <code>print()</code> method for <code>sprof</code> objects concatenates these three functions.

6.3. **Plot.**

```
oldpar<- par(mfrow=c(2,2))
plot_nodes(sprof)
par(oldpar)
```

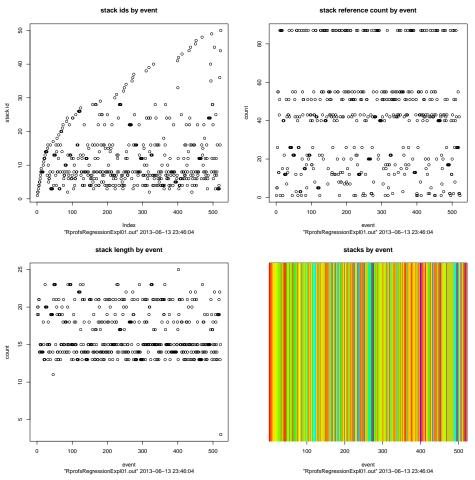






_ Input _

oldpar<- par(mfrow=c(2,2))
plot_profiles(sprof)
par(oldpar)</pre>



The plot() method for sprof objects concatenates these three functions.

7. Graph

In this section, we use the recent version of our example, **sprof02** for demonstration. You con re-run it, using your **sprof** data by modifying this instruction:

To interface sprof to a graph handling package, until() can extract the adjacency matrix from the profile.

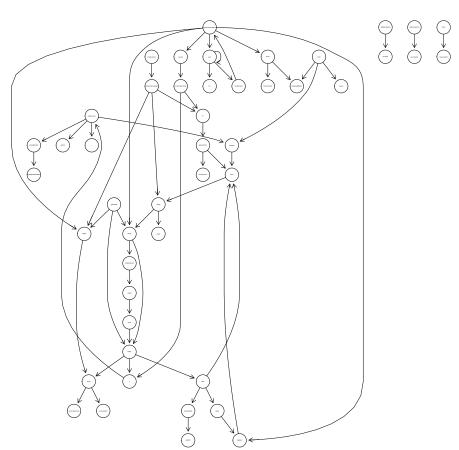
This is a format any graph package can handle.

7.1. graph Package.

```
library(graph)
sprofadjNEL <- as(sprofadj,"graphNEL")

plot(sprofadjNEL, main="graph layout", cex.main=2)
#detach("package:graph")</pre>
```

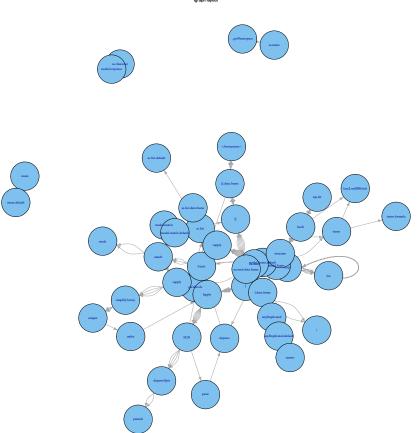
graph layout



7.1.1. igraph Package.

```
library(igraph)
sprofig <- graph.adjacency(sprofadj)

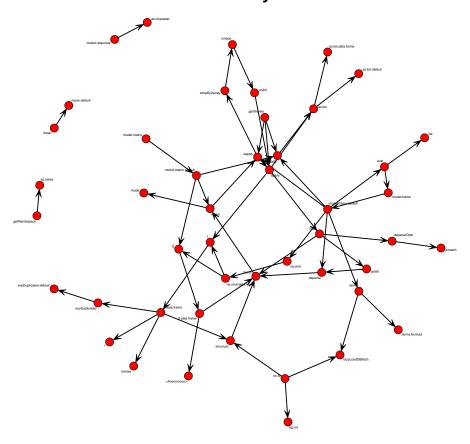
#plot(sprofig, main="igraph layout", cex.main=5)
plot(sprofig, main="igraph layout")
detach("package:igraph")</pre>
```



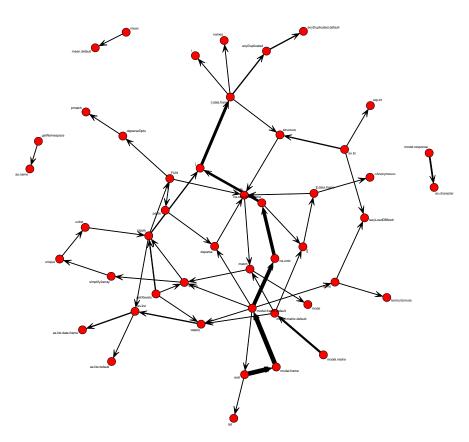
7.1.2. network Package.

library(network)
nwsprofadj <- as.network(sprofadj) # names is not imported
network.vertex.names(nwsprofadj) <- rownames(sprofadj) # not honoured by plot
plot(nwsprofadj, label=rownames(sprofadj), main="network layout", cex.main=5)</pre>

network layout



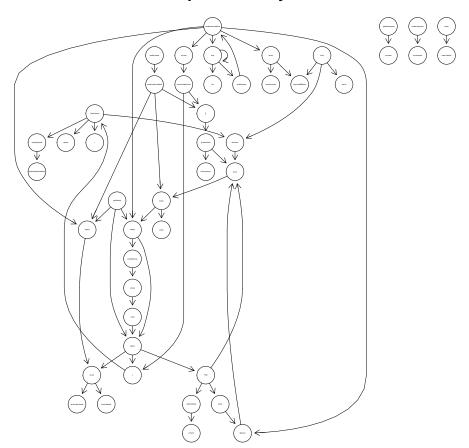
network layout



7.1.3. Rgraphviz Package.

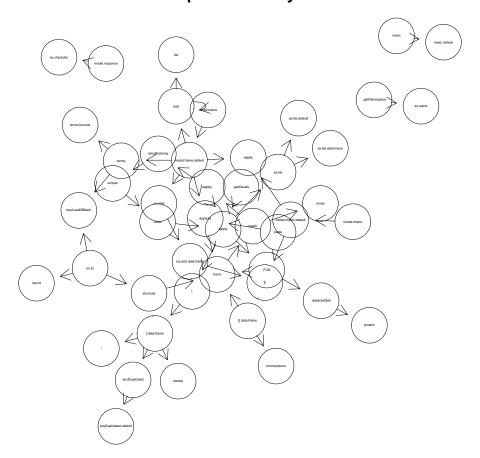
	Input
library(Rgraphviz)	
<pre>sprofadjRag <- agopen(sprofadjNEL,</pre>	<pre>name="Rprof Example")</pre>
	Input
nlot(cnrofediBag main="Cranhyiz d	

Graphviz dot layout



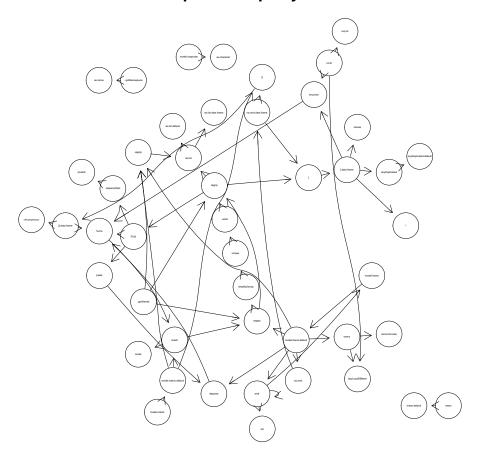
plot(sprofadjRag, "neato", main="Graphviz neto layout", cex.main=5)

Graphviz neto layout



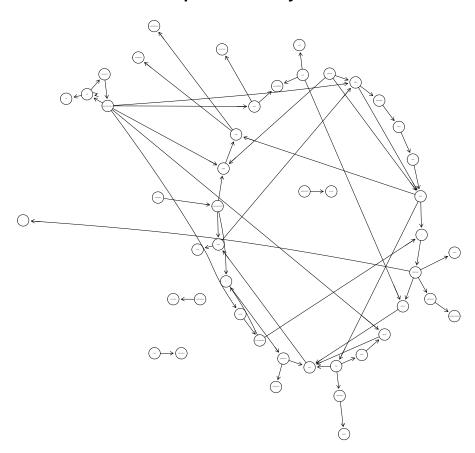
plot(sprofadjRag,"twopi", main="Graphviz twopi layout", cex.main=5)

Graphviz twopi layout



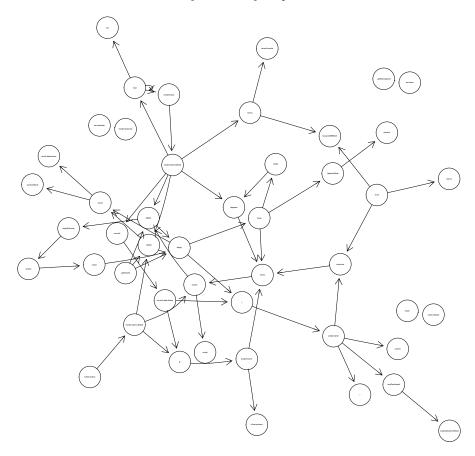
plot(sprofadjRag,"circo", main="Graphviz circo layout", cex.main=5)

Graphviz circo layout



plot(sprofadjRag,"fdp", main="Graphviz fdp layout", cex.main=5)

Graphviz fdp layout



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```

R session info:

- R version 3.0.1 (2013-05-16), x86_64-apple-darwin10.8.0
- Locale:

en_GB.UTF-8/en_GB.UTF-8/en_GB.UTF-8/c/en_GB.UTF-8

- Base packages: base, datasets, graphics, grDevices, grid, methods, stats, utils
- Other packages: graph 1.38.2, RColorBrewer 1.0-5, Rcpp 0.10.3, Rgraphviz 2.4.0, sprof 0.0-5, wordcloud 2.4, xtable 1.7-1
- Loaded via a namespace (and not attached): BiocGenerics 0.6.0, igraph 0.6.5-2, network 1.7.2, parallel 3.0.1, slam 0.1-28, stats4 3.0.1, tools 3.0.1

svn repository info:

\$Source: /u/math/j40/cvsroot/lectures/src/insider/profile/Rnw/profile.Rnw,v \$

\$Id: sprofiling.Rnw 163 2013-07-09 07:29:03Z gsawitzki \$

\$Revision: 163 \$

 $\mathtt{\$Date:}\ \ \mathtt{2013-07-09}\ \ \mathtt{09:29:03}\ \ 0200 (Tue, 09Jul 2013) +$

\$name: \$

\$Author: gsawitzki \$

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 $E\text{-}mail\ address: \verb|gs@statlab.uni-heidelberg.de|$

URL: http://sintro.r-forge.r-project.org/