

# Workflow examples with R2BEAT

## Scenario 1

Only a sampling frame containing the units of the population of reference is available, no previous round of the sampling survey to be planned

```
In [1]: # Install last version of R2BEAT and ReGenesees
#install.packages("devtools")
#devtools::install_github("DiegoZardetto/ReGenesees",dependencies = FALSE)
#devtools::install_github("barcaroli/R2BEAT",dependencies=FALSE)
library("R2BEAT")
```

Caricamento del pacchetto richiesto: devtools

Caricamento del pacchetto richiesto: usethis

Caricamento del pacchetto richiesto: sampling

Caricamento del pacchetto richiesto: glue

```
In [2]: packageVersion("R2BEAT")
```

```
[1] '1.0.4'
```

```
In [3]: ## Sampling frame
load("pop.RData")
str(pop)
```

```
'data.frame':  2258507 obs. of  13 variables:
 $ region      : Factor w/ 3 levels "north","center",...: 1 1 1 1 1 1 1 1 1 1 ...
 $ province    : Factor w/ 6 levels "north_1","north_2",...: 1 1 1 1 1 1 1 1 1 1 ...
 $ municipality: num  1 1 1 1 1 1 1 1 1 1 ...
 $ id_hh       : Factor w/ 963018 levels "H1","H10","H100",...: 1 1 1 2 3 3 3 3 1114
1114 ...
 $ id_ind      : int   1 2 3 4 5 6 7 8 9 10 ...
 $ stratum     : Factor w/ 24 levels "1000","2000",...: 12 12 12 12 12 12 12 12 12 1
2 ...
 $ stratum_label: chr   "north_1_6" "north_1_6" "north_1_6" "north_1_6" ...
 $ sex         : int   1 2 1 2 1 1 2 2 1 1 ...
 $ cl_age      : Factor w/ 8 levels "(0,14]","(14,24]",...: 3 7 8 5 4 6 6 4 4 1 ...
 $ active      : num   1 1 0 1 1 1 1 1 1 0 ...
 $ income_hh   : num   30488 30488 30488 21756 29871 ...
 $ unemployed  : num   0 0 0 0 0 0 0 0 0 0 ...
 $ inactive    : num   0 0 1 0 0 0 0 0 0 1 ...
```

## Precision constraints

```
In [4]: cv <- as.data.frame(list(DOM=c("DOM1","DOM2"),
                                CV1=c(0.02,0.03),
                                CV2=c(0.03,0.06),
                                CV3=c(0.03,0.06),
                                CV4=c(0.05,0.08)))
cv
```

A data.frame: 2 × 5

DOM	CV1	CV2	CV3	CV4
<chr>	<dbl>	<dbl>	<dbl>	<dbl>
DOM1	0.02	0.03	0.03	0.05
DOM2	0.03	0.06	0.06	0.08

## Sensitivity analysis

In [5]:

```
sens_min_SSU <- sensitivity_min_SSU (  
  samp_frame=pop,  
  errors=cv,  
  id_PSU="municipality",  
  id_SSU="id_ind",  
  strata_var="stratum",  
  target_vars=c("income_hh","active","inactive","unemployed"),  
  deff_var="stratum",  
  domain_var="region",  
  delta=1,  
  deff_sugg=1,  
  min=30,  
  max=80,  
  plot=TRUE)
```

Calculating strata...

Computations are being done on population data

Number of strata: 24

... of which with only one unit: 0

Calculating rho in strata...

Stratum 1000

Stratum 2000

Stratum 3000

Stratum 4000

Stratum 5000

Stratum 6000

Stratum 7000

Stratum 8000

Stratum 9000

Stratum 10000

Stratum 11000

Stratum 12000

Stratum 13000

Stratum 14000

Stratum 15000

Stratum 16000

Stratum 17000

Stratum 18000

Stratum 19000

Stratum 20000

Stratum 21000

Stratum 22000

Stratum 23000

Stratum 24000

```
1 iterations PSU_SR PSU NSR PSU Total SSU  
1          0      0      0      0 7836  
2          1     81    114    195 8049  
3          2     83    118    201 8049
```

```
2 iterations PSU_SR PSU NSR PSU Total SSU
```

1	0	0	0	0 7836
2	1	67	110	177 8099
3	2	68	112	180 8098

3	iterations	PSU_SR	PSU	NSR	PSU	Total	SSU
1		0	0	0		0 7836	
2		1	49	110		159 8164	
3		2	53	112		165 8157	

4	iterations	PSU_SR	PSU	NSR	PSU	Total	SSU
1		0	0	0		0 7836	
2		1	37	110		147 8222	
3		2	43	108		151 8217	

5	iterations	PSU_SR	PSU	NSR	PSU	Total	SSU
1		0	0	0		0 7836	
2		1	31	104		135 8281	
3		2	39	104		143 8271	
4		3	38	104		142 8273	

6	iterations	PSU_SR	PSU	NSR	PSU	Total	SSU
1		0	0	0		0 7836	
2		1	29	98		127 8343	
3		2	34	100		134 8332	

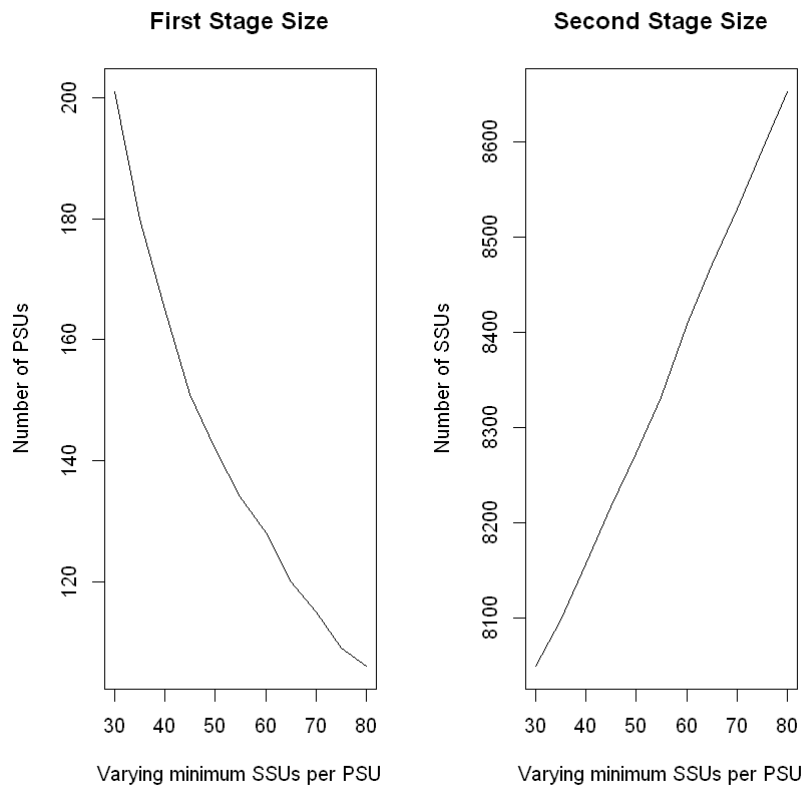
7	iterations	PSU_SR	PSU	NSR	PSU	Total	SSU
1		0	0	0		0 7836	
2		1	26	96		122 8406	
3		2	32	96		128 8408	

8	iterations	PSU_SR	PSU	NSR	PSU	Total	SSU
1		0	0	0		0 7836	
2		1	26	86		112 8475	
3		2	28	92		120 8472	

9	iterations	PSU_SR	PSU	NSR	PSU	Total	SSU
1		0	0	0		0 7836	
2		1	25	82		107 8545	
3		2	29	86		115 8530	

10	iterations	PSU_SR	PSU	NSR	PSU	Total	SSU
1		0	0	0		0 7836	
2		1	20	80		100 8596	
3		2	25	84		109 8592	

11	iterations	PSU_SR	PSU	NSR	PSU	Total	SSU
1		0	0	0		0 7836	
2		1	22	74		96 8662	
3		2	20	86		106 8653	



## Preparation of inputs for allocation steps

In [6]:

```
## Preparation of inputs for allocation steps
samp_frame <- pop
samp_frame$one <- 1
id_PSU <- "municipality"
id_SSU <- "id_ind"
strata_var <- "stratum"
target_vars <- c("income_hh", "active", "inactive", "unemployed")
deff_var <- "stratum"
domain_var <- "region"
delta = 1 # households = survey units
minimum <- 50 # minimum number of SSUs to be interviewed in each selected PSU
deff_sugg <- 1.5 # suggestion for the deff value

inp1 <- prepareInputToAllocation1(samp_frame,
                                  id_PSU,
                                  id_SSU,
                                  strata_var,
                                  target_vars,
                                  deff_var,
                                  domain_var,
                                  minimum,
                                  delta,
                                  deff_sugg)
```

Calculating strata...

Computations are being done on population data

Number of strata: 24

... of which with only one unit: 0

Calculating rho in strata...

Stratum 1000

Stratum 2000

Stratum 3000

Stratum 4000

```

Stratum 5000
Stratum 6000
Stratum 7000
Stratum 8000
Stratum 9000
Stratum 10000
Stratum 11000
Stratum 12000
Stratum 13000
Stratum 14000
Stratum 15000
Stratum 16000
Stratum 17000
Stratum 18000
Stratum 19000
Stratum 20000
Stratum 21000
Stratum 22000
Stratum 23000
Stratum 24000

```

In [7]:

```
head(inp1$strata)
```

A data.frame: 6 × 14

	<b>N</b>	<b>M1</b>	<b>M2</b>	<b>M3</b>	<b>M4</b>	<b>S1</b>	<b>S2</b>	<b>S3</b>	<b>S4</b>
	<dbl>	<dbl>	<dbl>	<dbl>	<dbl>	<dbl>	<dbl>	<dbl>	<dbl>
<b>1000</b>	197007	23959.87	0.6650322	0.2285807	0.10638708	22179.08	0.4719792	0.4199185	0.3083324
<b>2000</b>	261456	20966.65	0.6709886	0.2297519	0.09925953	19624.65	0.4698541	0.4206732	0.2990102
<b>3000</b>	115813	19814.73	0.6644591	0.2315975	0.10394343	14754.88	0.4721792	0.4218532	0.3051871
<b>4000</b>	17241	18732.72	0.6273418	0.2499275	0.12273070	13462.74	0.4835122	0.4329708	0.3281278
<b>5000</b>	101067	22070.31	0.6134445	0.2338845	0.15267100	17187.98	0.4869603	0.4232996	0.3596701
<b>6000</b>	47218	21069.07	0.6135796	0.2348469	0.15157355	17342.74	0.4869288	0.4239031	0.3586070

In [8]:

```
head(inp1$deff)
```

A data.frame: 6 × 6

	<b>STRATUM</b>	<b>DEFF1</b>	<b>DEFF2</b>	<b>DEFF3</b>	<b>DEFF4</b>	<b>b_nar</b>
	<fct>	<dbl>	<dbl>	<dbl>	<dbl>	<dbl>
<b>1</b>	1000	1.5	1.5	1.5	1.5	4925.17500
<b>12</b>	2000	1.5	1.5	1.5	1.5	1005.60000
<b>18</b>	3000	1.5	1.5	1.5	1.5	222.71731
<b>19</b>	4000	1.5	1.5	1.5	1.5	47.89167
<b>20</b>	5000	1.5	1.5	1.5	1.5	2526.67500
<b>21</b>	6000	1.5	1.5	1.5	1.5	786.96667

In [9]:

```
head(inp1$effst)
```

A data.frame: 6 × 5

	STRATUM	EFFST1	EFFST2	EFFST3	EFFST4
	<fct>	<dbl>	<dbl>	<dbl>	<dbl>
1	1000	1	1	1	1
2	2000	1	1	1	1
3	3000	1	1	1	1
4	4000	1	1	1	1
5	5000	1	1	1	1
6	6000	1	1	1	1

In [10]:

```
head(inp1$rho)
```

A data.frame: 6 × 9

	STRATUM	RHO_AR1	RHO_NAR1	RHO_AR2	RHO_NAR2	RHO_AR3	RHO_NAR3	RHO_NAR4
	<fct>	<dbl>	<dbl>	<dbl>	<dbl>	<dbl>	<dbl>	<dbl>
1	1000	1	0.0032494875	1	0.00001260175649	1	0.0000003631192	1
2	2000	1	0.0028554017	1	0.00150936389450	1	0.0007420929883	1
3	3000	1	0.0069678726	1	0.00162968276279	1	0.0006469515878	1
4	4000	1	0.0114552934	1	0.00578473329221	1	0.0019797687826	1
5	5000	1	0.0002677333	1	0.00000001682475	1	0.0000029484212	1
6	6000	1	0.0057050500	1	0.00004270905958	1	0.0000397945795	1

In [11]:

```
head(inp1$psu_file)
```

A data.frame: 6 × 3

	PSU_ID	STRATUM	PSU_MOS
	<dbl>	<fct>	<dbl>
1	1	12000	1546
2	2	12000	936
3	3	12000	367
4	4	10000	13032
5	5	12000	678
6	6	11000	3193

In [12]:

```
head(inp1$des_file)
```

A data.frame: 6 × 4

	STRATUM	STRAT_MOS	DELTA	MINIMUM
	<fct>	<dbl>	<dbl>	<dbl>
1	1000	197007	1	50

	STRATUM	STRAT_MOS	DELTA	MINIMUM
	<fct>	<dbl>	<dbl>	<dbl>
2	2000	261456	1	50
3	3000	115813	1	50
4	4000	17241	1	50
5	5000	101067	1	50
6	6000	47218	1	50

## Allocation

In [13]:

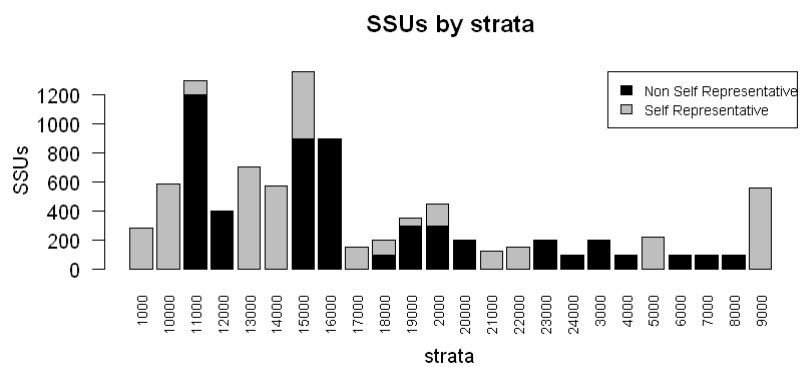
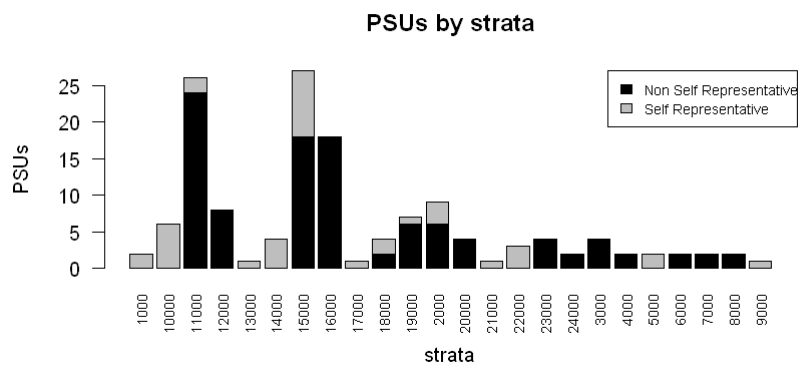
```
inp1$desfile$MINIMUM <- 50
alloc1 <- beat.2st(stratif = inp1$strata,
  errors = cv,
  des_file = inp1$des_file,
  psu_file = inp1$psu_file,
  rho = inp1$rho,
  deft_start = NULL,
  effst = inp1$effst,
  minPSUstrat = 2,
  minnumstrat = 50
)
```

	iterations	PSU_SR	PSU	NSR	PSU	Total	SSU
1	0	0	0	0	0	7887	
2	1	31	104		135	8328	
3	2	39	104		143	8317	
4	3	38	104		142	8320	

## Selection of PSUs (I stage)

In [14]:

```
set.seed(1234)
sample_1st <- select_PSU(alloc1, type="ALLOC", pps=TRUE)
```



In [15]:

```
sample_1st$PSU_stats
```

A data.frame: 25 × 7

STRATUM	PSU	PSU_SR	PSU_NSR	SSU	SSU_SR	SSU_NSR
<chr>	<dbl>	<dbl>	<dbl>	<dbl>	<dbl>	<dbl>
1000	2	2	0	286	286	0
2000	9	3	6	452	152	300
3000	4	0	4	200	0	200
4000	2	0	2	100	0	100
5000	2	2	0	219	219	0
6000	2	0	2	100	0	100
7000	2	0	2	100	0	100
8000	2	0	2	100	0	100
9000	1	1	0	557	557	0
10000	6	6	0	587	587	0
11000	26	2	24	1300	100	1200
12000	8	0	8	400	0	400
13000	1	1	0	703	703	0
14000	4	4	0	577	577	0
15000	27	9	18	1361	461	900
16000	18	0	18	900	0	900
17000	1	1	0	154	154	0



STRATUM	PSU	PSU_SR	PSU_NSR	SSU	SSU_SR	SSU_NSR
<chr>	<dbl>	<dbl>	<dbl>	<dbl>	<dbl>	<dbl>
18000	4	2	2	200	100	100
19000	7	1	6	350	50	300
20000	4	0	4	200	0	200
21000	1	1	0	125	125	0
22000	3	3	0	150	150	0
23000	4	0	4	200	0	200
24000	2	0	2	100	0	100
Total	142	38	104	9421	4221	5200

## Selection of SSUs (II stage)

In [16]:

```
samp <- select_SSU(df=pop,
  PSU_code="municipality",
  SSU_code="id_ind",
  PSU_sampled=sample_1st$sample_PSU,
  verbose=TRUE)
```

```
PSU = 1 *** Selected SSU = 50
PSU = 4 *** Selected SSU = 72
PSU = 6 *** Selected SSU = 50
PSU = 8 *** Selected SSU = 557
PSU = 11 *** Selected SSU = 105
PSU = 13 *** Selected SSU = 79
PSU = 15 *** Selected SSU = 50
PSU = 16 *** Selected SSU = 50
PSU = 17 *** Selected SSU = 50
PSU = 18 *** Selected SSU = 50
PSU = 21 *** Selected SSU = 50
PSU = 24 *** Selected SSU = 50
PSU = 29 *** Selected SSU = 50
PSU = 33 *** Selected SSU = 50
PSU = 34 *** Selected SSU = 50
PSU = 36 *** Selected SSU = 50
PSU = 37 *** Selected SSU = 50
PSU = 40 *** Selected SSU = 87
PSU = 41 *** Selected SSU = 58
PSU = 51 *** Selected SSU = 186
PSU = 56 *** Selected SSU = 50
PSU = 59 *** Selected SSU = 50
PSU = 61 *** Selected SSU = 50
PSU = 67 *** Selected SSU = 50
PSU = 72 *** Selected SSU = 50
PSU = 80 *** Selected SSU = 50
PSU = 82 *** Selected SSU = 50
PSU = 85 *** Selected SSU = 50
PSU = 89 *** Selected SSU = 50
PSU = 90 *** Selected SSU = 50
PSU = 91 *** Selected SSU = 50
PSU = 92 *** Selected SSU = 50
PSU = 95 *** Selected SSU = 50
PSU = 98 *** Selected SSU = 50
PSU = 102 *** Selected SSU = 50
PSU = 104 *** Selected SSU = 50
```

PSU = 105	***	Selected	SSU = 50
PSU = 109	***	Selected	SSU = 50
PSU = 110	***	Selected	SSU = 50
PSU = 112	***	Selected	SSU = 50
PSU = 113	***	Selected	SSU = 50
PSU = 117	***	Selected	SSU = 52
PSU = 121	***	Selected	SSU = 107
PSU = 122	***	Selected	SSU = 50
PSU = 123	***	Selected	SSU = 50
PSU = 126	***	Selected	SSU = 50
PSU = 130	***	Selected	SSU = 50
PSU = 138	***	Selected	SSU = 50
PSU = 142	***	Selected	SSU = 50
PSU = 155	***	Selected	SSU = 50
PSU = 156	***	Selected	SSU = 50
PSU = 161	***	Selected	SSU = 50
PSU = 162	***	Selected	SSU = 50
PSU = 170	***	Selected	SSU = 50
PSU = 175	***	Selected	SSU = 50
PSU = 180	***	Selected	SSU = 50
PSU = 182	***	Selected	SSU = 50
PSU = 186	***	Selected	SSU = 52
PSU = 187	***	Selected	SSU = 50
PSU = 189	***	Selected	SSU = 50
PSU = 192	***	Selected	SSU = 50
PSU = 197	***	Selected	SSU = 50
PSU = 198	***	Selected	SSU = 50
PSU = 201	***	Selected	SSU = 57
PSU = 210	***	Selected	SSU = 50
PSU = 211	***	Selected	SSU = 50
PSU = 214	***	Selected	SSU = 130
PSU = 221	***	Selected	SSU = 103
PSU = 223	***	Selected	SSU = 50
PSU = 224	***	Selected	SSU = 50
PSU = 228	***	Selected	SSU = 237
PSU = 233	***	Selected	SSU = 50
PSU = 235	***	Selected	SSU = 50
PSU = 238	***	Selected	SSU = 50
PSU = 239	***	Selected	SSU = 50
PSU = 241	***	Selected	SSU = 50
PSU = 243	***	Selected	SSU = 50
PSU = 246	***	Selected	SSU = 50
PSU = 248	***	Selected	SSU = 50
PSU = 251	***	Selected	SSU = 50
PSU = 256	***	Selected	SSU = 50
PSU = 259	***	Selected	SSU = 703
PSU = 269	***	Selected	SSU = 50
PSU = 270	***	Selected	SSU = 50
PSU = 272	***	Selected	SSU = 50
PSU = 275	***	Selected	SSU = 50
PSU = 276	***	Selected	SSU = 50
PSU = 283	***	Selected	SSU = 50
PSU = 288	***	Selected	SSU = 50
PSU = 290	***	Selected	SSU = 50
PSU = 291	***	Selected	SSU = 50
PSU = 292	***	Selected	SSU = 50
PSU = 294	***	Selected	SSU = 50
PSU = 302	***	Selected	SSU = 50
PSU = 304	***	Selected	SSU = 52
PSU = 306	***	Selected	SSU = 50
PSU = 309	***	Selected	SSU = 74
PSU = 311	***	Selected	SSU = 50
PSU = 314	***	Selected	SSU = 50
PSU = 315	***	Selected	SSU = 50
PSU = 317	***	Selected	SSU = 50

```

PSU = 324 *** Selected SSU = 50
PSU = 325 *** Selected SSU = 50
PSU = 330 *** Selected SSU = 212
PSU = 341 *** Selected SSU = 50
PSU = 342 *** Selected SSU = 50
PSU = 343 *** Selected SSU = 50
PSU = 347 *** Selected SSU = 50
PSU = 351 *** Selected SSU = 50
PSU = 363 *** Selected SSU = 50
PSU = 367 *** Selected SSU = 50
PSU = 370 *** Selected SSU = 50
PSU = 372 *** Selected SSU = 50
PSU = 373 *** Selected SSU = 50
PSU = 380 *** Selected SSU = 50
PSU = 382 *** Selected SSU = 169
PSU = 387 *** Selected SSU = 50
PSU = 390 *** Selected SSU = 50
PSU = 421 *** Selected SSU = 50
PSU = 425 *** Selected SSU = 50
PSU = 427 *** Selected SSU = 50
PSU = 439 *** Selected SSU = 50
PSU = 443 *** Selected SSU = 50
PSU = 445 *** Selected SSU = 154
PSU = 448 *** Selected SSU = 50
PSU = 452 *** Selected SSU = 50
PSU = 471 *** Selected SSU = 50
PSU = 474 *** Selected SSU = 50
PSU = 475 *** Selected SSU = 50
PSU = 476 *** Selected SSU = 50
PSU = 477 *** Selected SSU = 50
PSU = 480 *** Selected SSU = 50
PSU = 485 *** Selected SSU = 50
PSU = 492 *** Selected SSU = 50
PSU = 494 *** Selected SSU = 50
PSU = 496 *** Selected SSU = 125
PSU = 499 *** Selected SSU = 50
PSU = 502 *** Selected SSU = 50
PSU = 503 *** Selected SSU = 50
PSU = 504 *** Selected SSU = 50
PSU = 510 *** Selected SSU = 50
PSU = 512 *** Selected SSU = 50
-----
Total PSU = 142
Total SSU = 9421
-----

```

```

In [17]: nrow(samp)
          sum(alloc1$alloc$ALLOC[-nrow(alloc1$alloc)])

```

```

9421
8320

```

```

In [18]: nrow(pop)
          sum(samp$weight)

```

```

2258507
2258507

```

```

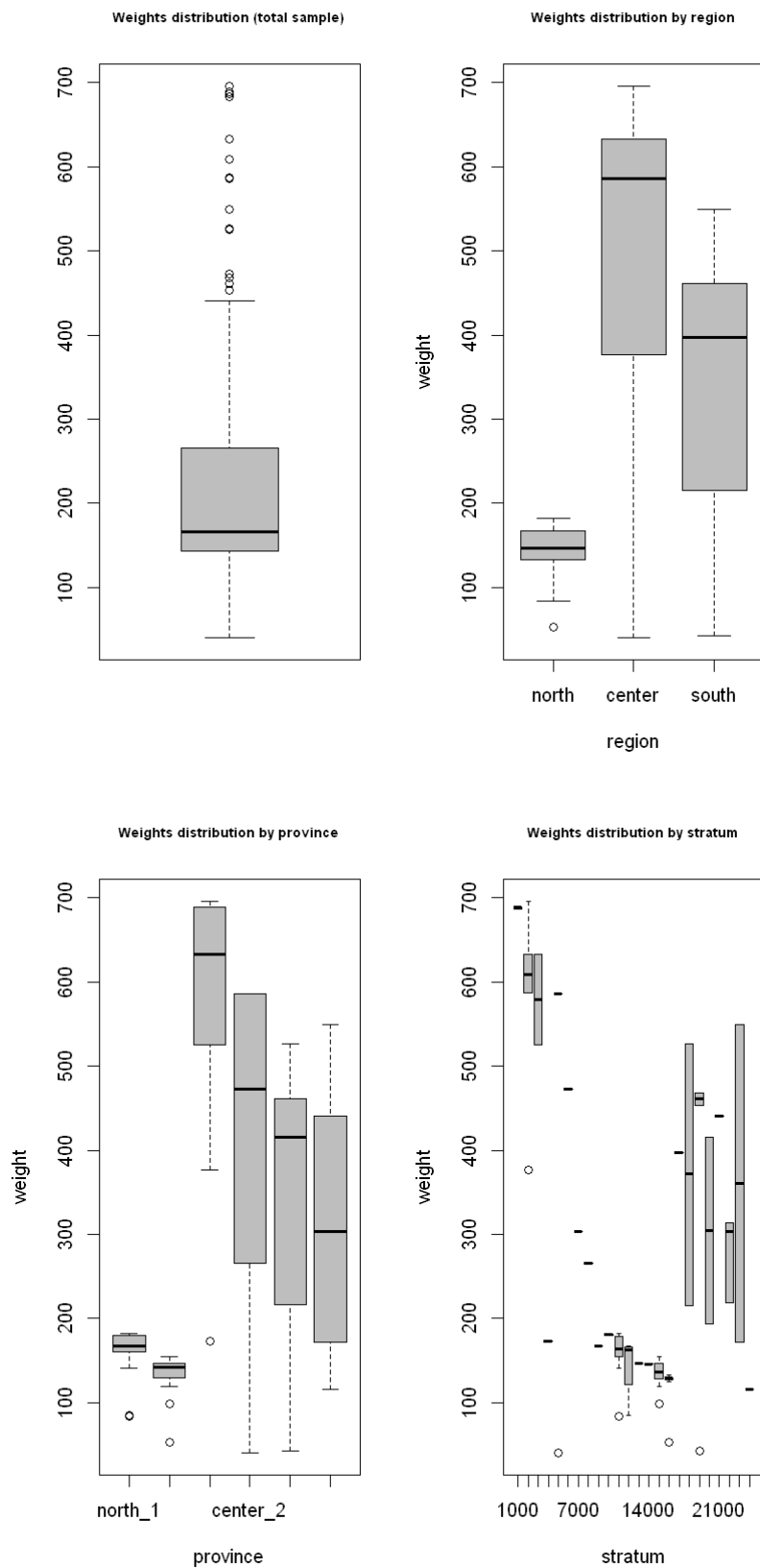
In [19]: ## Plot of weights distribution
          par(mfrow=c(1, 2))
          boxplot(samp$weight,col="grey")
          title("Weights distribution (total sample)",cex.main=0.7)

```

```

boxplot(weight ~ region, data=samp,col="grey")
title("Weights distribution by region",cex.main=0.7)
par(mfrow=c(1, 2))
boxplot(weight ~ province, data=samp,col="grey")
title("Weights distribution by province",cex.main=0.7)
boxplot(weight ~ stratum, data=samp,col="grey")
title("Weights distribution by stratum",cex.main=0.7)

```



Precision constraints compliance control (by

## simulation)

In [20]:

```
df=pop
df$one <- 1
PSU_code="municipality"
SSU_code="id_ind"
target_vars <- c("income_hh",
                 "active",
                 "inactive",
                 "unemployed")
```

In [21]:

```
# Domain level = national
domain_var <- "one"
set.seed(1234)
eval11 <- eval_2stage(df,
                     PSU_code,
                     SSU_code,
                     domain_var,
                     target_vars,
                     sample_1st$sample_PSU,
                     nsampl=100,
                     writeFiles=FALSE,
                     progress=TRUE)

eval11$coeff_var
```

|=====| 100%

A data.frame: 1 × 5

CV1	CV2	CV3	CV4	dom
<dbl>	<dbl>	<dbl>	<dbl>	<chr>
0.0091	0.0086	0.0238	0.0346	DOM1

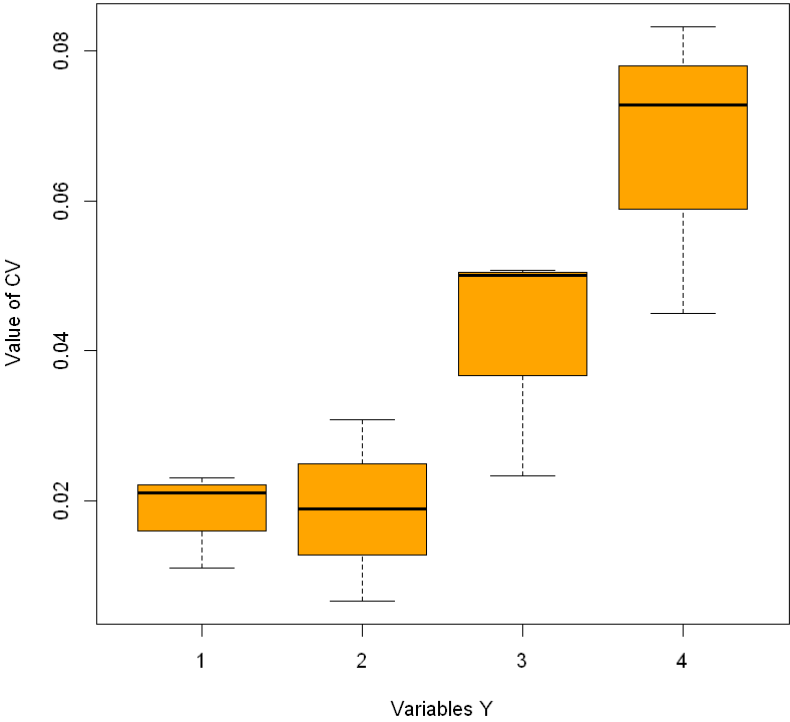
In [22]:

```
# Domain level = regional
domain_var <- "region"
set.seed(1234)
set.seed(1234)
eval12 <- eval_2stage(df,
                     PSU_code,
                     SSU_code,
                     domain_var,
                     target_vars,
                     sample_1st$sample_PSU,
                     nsampl=100,
                     writeFiles=FALSE,
                     progress=TRUE)

eval12$coeff_var
```

|=====| 100%

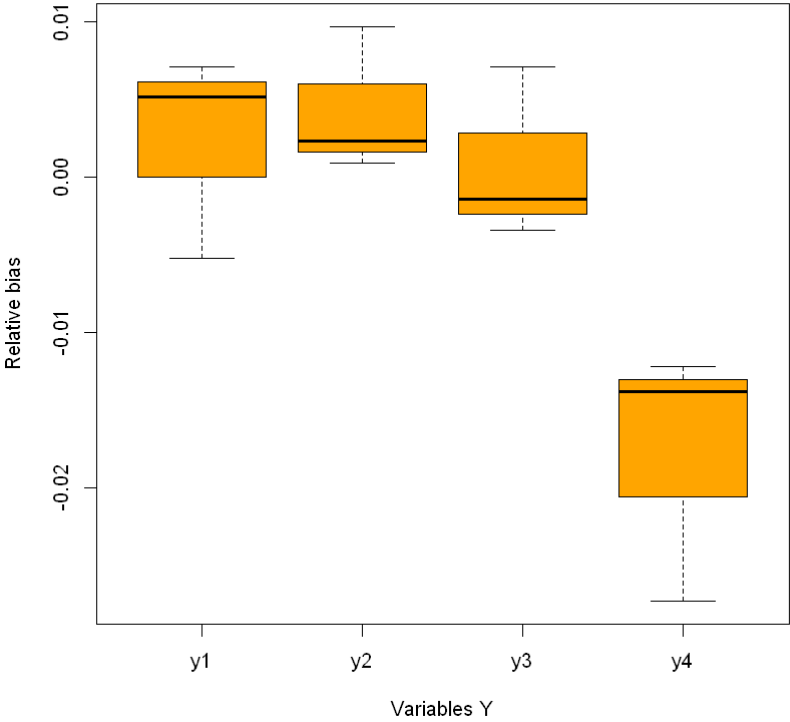
Distribution of CV's in the domains



A data.frame: 3 × 5

CV1	CV2	CV3	CV4	dom
<dbl>	<dbl>	<dbl>	<dbl>	<chr>
0.0109	0.0066	0.0234	0.0833	DOM1
0.0210	0.0189	0.0500	0.0728	DOM2
0.0231	0.0309	0.0508	0.0450	DOM3

Distribution of relative bias in the domains



```
In [23]: alloc1$sensitivity
```

A data.frame: 4 × 6

	Type	Dom	V1	V2	V3	V4
	<chr>	<chr>	<dbl>	<dbl>	<dbl>	<dbl>
2	DOM1	1	1	0	1	1
6	DOM2	1	1	0	1	1181
10	DOM2	2	1	0	1	245
14	DOM2	3	184	1	45	1

```
In [24]: save(samp,file="sample.RData")
```

## Scenario 2

One previous round of the sampling survey is available.

## Analysis of sampled data

```
In [25]: library(ReGenesees)
```

```
-----  
> The ReGenesees package has been successfully loaded. <  
-----
```

Package: ReGenesees  
Type: Package  
Title: R Evolved Generalized Software for Sampling Estimates and Errors  
in Surveys  
Description: Design-Based and Model-Assisted analysis of complex  
sampling surveys. Multistage, stratified, clustered, unequally  
weighted survey designs. Horvitz-Thompson and Calibration  
Estimators. Variance Estimation for nonlinear smooth estimators  
by Taylor-series linearization. Estimates, standard errors,  
confidence intervals and design effects for: Totals, Means,  
absolute and relative Frequency Distributions (marginal,  
conditional and joint), Ratios, Shares and Ratios of Shares,  
Multiple Regression Coefficients and Quantiles. Automated  
Linearization of Complex Analytic Estimators. Design Covariance  
and Correlation. Estimates, standard errors, confidence  
intervals and design effects for user-defined analytic  
estimators. Estimates and sampling errors for subpopulations.  
Consistent trimming of calibration weights. Calibration on  
complex population parameters, e.g. multiple regression  
coefficients. Generalized Variance Functions (GVF) method for  
predicting variance estimates.

```

Version: 2.1
Author: Diego Zardetto [aut, cre]
Maintainer: Diego Zardetto <zardetto@istat.it>
Authors@R: person("Diego", "Zardetto", role = c("aut", "cre"), email =
  "zardetto@istat.it")
License: EUPL
URL: https://diegozardetto.github.io/ReGenesees/,
  https://github.com/DiegoZardetto/ReGenesees/
BugReports: https://github.com/DiegoZardetto/ReGenesees/issues/
Imports: stats, MASS
Depends: R (>= 2.14.0)
ByteCompile: TRUE
RemoteType: github
RemoteHost: api.github.com
RemoteRepo: ReGenesees
RemoteUsername: DiegoZardetto
RemoteRef: HEAD
RemoteSha: c0bd789ed6ab88a4b3a02bd553f51d8f4ec857e2
GithubRepo: ReGenesees
GithubUsername: DiegoZardetto
GithubRef: HEAD
GithubSHA1: c0bd789ed6ab88a4b3a02bd553f51d8f4ec857e2
NeedsCompilation: no
Packaged: 2021-09-28 11:33:29 UTC; Giulio
Built: R 4.1.1; ; 2021-09-28 11:33:35 UTC; windows

```

In [26]:

```

load("sample.RData")
str(samp)

```

```

'data.frame':  9421 obs. of  20 variables:
 $ municipality : Factor w/ 142 levels "1","4","6","8",...: 1 1 1 1 1 1 1 1 1 1 ...
 $ id_ind       : int  11 19 34 67 141 166 170 191 208 308 ...
 $ region      : Factor w/  3 levels "north","center",...: 1 1 1 1 1 1 1 1 1 1 ...
 $ province    : Factor w/  6 levels "north_1","north_2",...: 1 1 1 1 1 1 1 1 1 1 ...
 $ id_hh       : Factor w/ 963018 levels "H1","H10","H100",...: 1114 4447 10002 2000
2 45558 52224 54446 58891 63335 95557 ...
 $ stratum     : Factor w/ 24 levels "1000","2000",...: 12 12 12 12 12 12 12 12 12 1
2 ...
 $ stratum_label: chr  "north_1_6" "north_1_6" "north_1_6" "north_1_6" ...
 $ sex         : int  2 2 2 1 1 1 1 2 1 2 ...
 $ cl_age      : Factor w/  8 levels "(0,14]","(14,24]",...: 3 5 5 5 1 1 1 8 1 1 ...
 $ active      : num  1 1 0 1 0 0 0 0 0 0 ...
 $ income_hh   : num  17043 28143 4791 28043 27185 ...
 $ unemployed  : num  0 0 1 0 0 0 0 0 0 0 ...
 $ inactive    : num  0 0 0 0 1 1 1 1 1 1 ...
 $ Prob_1st    : num  0.187 0.187 0.187 0.187 0.187 ...
 $ Prob_2st    : num  0.0323 0.0323 0.0323 0.0323 0.0323 ...
 $ Prob_tot    : num  0.00604 0.00604 0.00604 0.00604 0.00604 ...
 $ weight      : num  166 166 166 166 166 ...
 $ SR          : num  0 0 0 0 0 0 0 0 0 0 ...
 $ nSR         : num  1 1 1 1 1 1 1 1 1 1 ...
 $ stratum_2   : chr  "12000-2" "12000-2" "12000-2" "12000-2" ...

```

In [27]:

```

## Sample design description
samp$stratum_2 <- as.factor(samp$stratum_2)
sample.des <- e.svydesign(samp,
  ids= ~ municipality + id_hh,
  strata = ~ stratum_2,
  weights = ~ weight,
  self.rep.str = ~ SR,
  check.data = TRUE)

```



```
# Empty levels found in factors: id_hh
# Empty levels have been dropped!
```

```
Warning message in e.svydesign(samp, ids = ~municipality + id_hh, strata = ~stratum_
2, :
"Sampling variance estimation for this design will take into account only leading co
ntributions, i.e. PSUs in not-SR strata and SSUs in SR strata (see ?e.svydesign and
?ReGenesees.options for details)"
```

```
In [29]: ## Find and collapse lonely strata
ls <- find.lon.strata(sample.des)
if (!is.null(ls)) sample.des <- collapse.strata(sample.des)

# No lonely PSUs found!
```

```
In [30]: ## Calibration with known totals
totals <- pop.template(sample.des,
  calmodel = ~ sex : cl_age,
  partition = ~ region)
totals <- fill.template(pop, totals, mem.frac = 10)
sample.cal <- e.calibrate(sample.des,
  totals,
  calmodel = ~ sex : cl_age,
  partition = ~ region,
  calfun = "logit",
  bounds = c(0.3, 2.6),
  aggregate.stage = 2,
  force = FALSE)

# Coherence check between 'universe' and 'template': OK
```

## Preparation of inputs for allocation steps

```
In [31]: samp_frame <- pop
RGdes <- sample.des
RGcal <- sample.cal
strata_var <- c("stratum")
target_vars <- c("income_hh",
  "active",
  "inactive",
  "unemployed")
weight_var <- "weight"
deff_var <- "stratum"
id_PSU <- c("municipality")
id_SSU <- c("id_hh")
domain_var <- c("region")
delta <- 1
minimum <- 50

inp2 <- prepareInputToAllocation2(
  samp_frame, # sampling frame
  RGdes,      # ReGenesees design object
  RGcal,      # ReGenesees calibrated object
  id_PSU,     # identification variable of PSUs
  id_SSU,     # identification variable of SSUs
  strata_var, # strata variable
  target_vars, # target variables
  deff_var,   # deff variable
  domain_var, # domain variable
  delta,      # Average number of SSUs for each selection unit
```

```

    minimum      # Minimum number of SSUs to be selected in each PSU
  )

```

In [32]:

```
head(inp2$strata)
```

A data.frame: 6 × 15

	stratum	STRATUM	N	M1	M2	M3	M4	S1	S2	
	<fct>	<chr>	<dbl>	<dbl>	<dbl>	<dbl>	<dbl>	<dbl>	<dbl>	
1	1000	1000	196189	22364.93	0.6793373	0.2322720	0.08839079	16556.88	0.4667313	0.4
2	10000	10000	105863	29427.86	0.7921197	0.1912077	0.01667262	27040.22	0.4057907	0.3
3	11000	11000	205526	28506.72	0.7749079	0.2063259	0.01876620	43089.05	0.4176429	0.4
4	12000	12000	57552	24275.15	0.7521653	0.2222993	0.02553542	16210.24	0.4317553	0.4
5	13000	13000	103001	28517.71	0.7654855	0.2004329	0.03408161	22588.38	0.4236950	0.4
6	14000	14000	84100	24332.26	0.7365891	0.2336707	0.02974023	15393.85	0.4404834	0.4

In [33]:

```
head(inp2$deff)
```

A data.frame: 6 × 7

	stratum	STRATUM	DEFF1	DEFF2	DEFF3	DEFF4	b_nar
	<fct>	<chr>	<dbl>	<dbl>	<dbl>	<dbl>	<dbl>
1	1000	1000	0.992453	1.000576	1.001071	1.004864	143.00000
2	10000	10000	1.020615	1.014979	1.015570	1.002514	97.83333
3	11000	11000	1.661060	0.792896	0.637480	1.036756	50.00000
4	12000	12000	1.200498	2.667262	2.533419	1.983936	50.00000
5	13000	13000	1.014184	1.011510	1.013485	1.007290	703.00000
6	14000	14000	1.012919	0.996743	0.996826	1.010600	144.25000

In [34]:

```
head(inp2$effst)
```

A data.frame: 6 × 6

	stratum	STRATUM	EFFST1	EFFST2	EFFST3	EFFST4
	<fct>	<chr>	<dbl>	<dbl>	<dbl>	<dbl>
1	1000	1000	1.061891	0.9511291	0.9071854	1.0137193
2	10000	10000	1.005724	0.9077114	0.8991158	0.9780552
3	11000	11000	1.005722	0.9309392	0.9240808	0.9998968
4	12000	12000	1.026967	0.9241132	0.9117161	0.9911560
5	13000	13000	1.006354	0.9244961	0.9085689	0.9977077
6	14000	14000	1.002360	0.9348739	0.9237139	1.0065308

In [35]:

```
head(inp2$rho)
```

A data.frame: 6 × 9

	STRATUM	RHO_AR1	RHO_NAR1	RHO_AR2	RHO_NAR2	RHO_AR3	RHO_NAR3	RHO_NAR3
	<chr>	<dbl>	<dbl>	<dbl>	<dbl>	<dbl>	<dbl>	<dbl>
1	1000	1	-0.00005314789	1	0.000004056338	1	0.000007542254	
2	10000	1	0.00021289157	1	0.000154688468	1	0.000160791738	
3	11000	1	0.01349102041	1	-0.004226612245	1	-0.007398367347	
4	12000	1	0.00409179592	1	0.034025755102	1	0.031294265306	
5	13000	1	0.00002020513	1	0.000016396011	1	0.000019209402	
6	14000	1	0.00009018499	1	-0.000022736475	1	-0.000022157068	

In [36]:

```
head(inp2$psu_file)
```

A data.frame: 6 × 3

	PSU_ID	STRATUM	PSU_MOS
	<dbl>	<fct>	<dbl>
1	309	1000	50845
2	330	1000	146162
3	292	2000	24794
4	293	2000	19609
5	300	2000	13897
6	304	2000	36195

In [37]:

```
head(inp2$des_file)
```

A data.frame: 6 × 4

	STRATUM	STRAT_MOS	DELTA	MINIMUM
	<fct>	<dbl>	<dbl>	<dbl>
1	1000	197007	1	50
2	2000	261456	1	50
3	3000	115813	1	50
4	4000	17241	1	50
5	5000	101067	1	50
6	6000	47218	1	50

## Allocation

In [38]:

```
set.seed(1234)
inp2$des_file$MINIMUM <- 50
alloc2 <- beat.2st(stratif = inp2$strata,
                  errors = cv,
                  des_file = inp2$des_file,
```

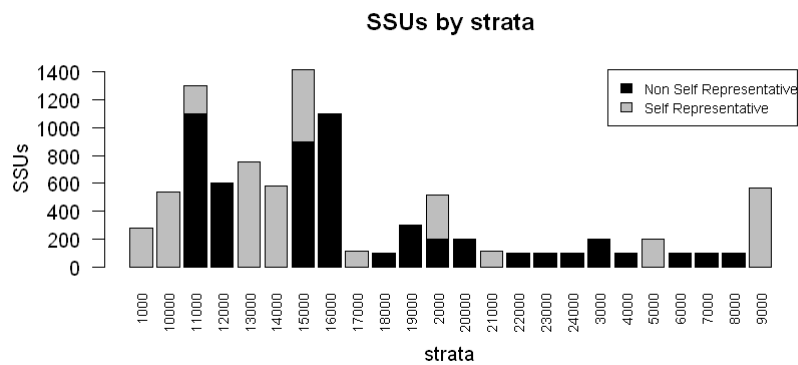
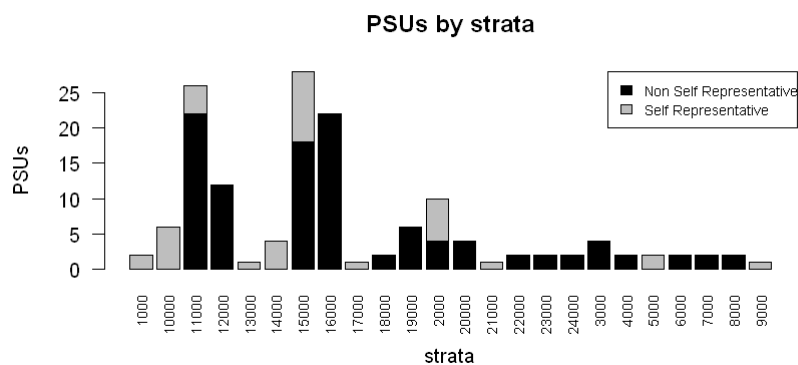
```
psu_file = inp2$psu_file,
rho = inp2$rho,
deft_start = NULL,
effst = inp2$effst,
minnumstrat = 2,
minPSUstrat = 2)
```

```
iterations PSU_SR PSU NSR PSU Total SSU
1          0      0      0      0 9557
2          1     71     92     163 8464
3          2     38    108     146 8398
4          3     38    108     146 8396
```

## Selection of PSUs (I stage)

In [39]:

```
set.seed(1234)
sample_1st <- select_PSU(alloc2, type="ALLOC", pps=TRUE)
```



In [40]:

```
sample_1st$PSU_stats
```

A data.frame: 25 × 7

STRATUM	PSU	PSU_SR	PSU_NSR	SSU	SSU_SR	SSU_NSR
<chr>	<dbl>	<dbl>	<dbl>	<dbl>	<dbl>	<dbl>
1000	2	2	0	279	279	0
2000	10	6	4	517	317	200
3000	4	0	4	200	0	200
4000	2	0	2	100	0	100
5000	2	2	0	202	202	0
6000	2	0	2	100	0	100

STRATUM	PSU	PSU_SR	PSU_NSR	SSU	SSU_SR	SSU_NSR
<chr>	<dbl>	<dbl>	<dbl>	<dbl>	<dbl>	<dbl>
7000	2	0	2	100	0	100
8000	2	0	2	100	0	100
9000	1	1	0	564	564	0
10000	6	6	0	537	537	0
11000	26	4	22	1300	200	1100
12000	12	0	12	600	0	600
13000	1	1	0	756	756	0
14000	4	4	0	583	583	0
15000	28	10	18	1414	514	900
16000	22	0	22	1100	0	1100
17000	1	1	0	114	114	0
18000	2	0	2	100	0	100
19000	6	0	6	300	0	300
20000	4	0	4	200	0	200
21000	1	1	0	113	113	0
22000	2	0	2	100	0	100
23000	2	0	2	100	0	100
24000	2	0	2	100	0	100
Total	146	38	108	9579	4179	5400

## Selection of SSUs (II stage)

In [41]:

```
set.seed(1234)
samp <- select_SSU(df=pop,
  PSU_code="municipality",
  SSU_code="id_ind",
  PSU_sampled=sample_1st$sample_PSU,
  verbose=TRUE)
```

```
PSU = 4 *** Selected SSU = 66
PSU = 8 *** Selected SSU = 564
PSU = 10 *** Selected SSU = 50
PSU = 11 *** Selected SSU = 96
PSU = 13 *** Selected SSU = 72
PSU = 15 *** Selected SSU = 50
PSU = 17 *** Selected SSU = 50
PSU = 19 *** Selected SSU = 50
PSU = 22 *** Selected SSU = 50
PSU = 27 *** Selected SSU = 50
PSU = 29 *** Selected SSU = 50
PSU = 34 *** Selected SSU = 50
PSU = 36 *** Selected SSU = 50
PSU = 40 *** Selected SSU = 79
PSU = 41 *** Selected SSU = 53
PSU = 44 *** Selected SSU = 50
```

PSU = 50	***	Selected	SSU = 50
PSU = 51	***	Selected	SSU = 171
PSU = 52	***	Selected	SSU = 50
PSU = 53	***	Selected	SSU = 50
PSU = 55	***	Selected	SSU = 50
PSU = 56	***	Selected	SSU = 50
PSU = 59	***	Selected	SSU = 50
PSU = 61	***	Selected	SSU = 50
PSU = 64	***	Selected	SSU = 50
PSU = 67	***	Selected	SSU = 50
PSU = 71	***	Selected	SSU = 50
PSU = 72	***	Selected	SSU = 50
PSU = 73	***	Selected	SSU = 50
PSU = 77	***	Selected	SSU = 50
PSU = 79	***	Selected	SSU = 50
PSU = 85	***	Selected	SSU = 50
PSU = 88	***	Selected	SSU = 50
PSU = 92	***	Selected	SSU = 50
PSU = 93	***	Selected	SSU = 50
PSU = 94	***	Selected	SSU = 50
PSU = 95	***	Selected	SSU = 50
PSU = 96	***	Selected	SSU = 50
PSU = 106	***	Selected	SSU = 50
PSU = 107	***	Selected	SSU = 50
PSU = 108	***	Selected	SSU = 50
PSU = 109	***	Selected	SSU = 50
PSU = 113	***	Selected	SSU = 50
PSU = 114	***	Selected	SSU = 50
PSU = 116	***	Selected	SSU = 50
PSU = 117	***	Selected	SSU = 53
PSU = 120	***	Selected	SSU = 50
PSU = 121	***	Selected	SSU = 109
PSU = 122	***	Selected	SSU = 50
PSU = 123	***	Selected	SSU = 50
PSU = 124	***	Selected	SSU = 50
PSU = 130	***	Selected	SSU = 50
PSU = 136	***	Selected	SSU = 50
PSU = 138	***	Selected	SSU = 50
PSU = 140	***	Selected	SSU = 50
PSU = 142	***	Selected	SSU = 50
PSU = 143	***	Selected	SSU = 50
PSU = 156	***	Selected	SSU = 50
PSU = 161	***	Selected	SSU = 50
PSU = 162	***	Selected	SSU = 50
PSU = 163	***	Selected	SSU = 50
PSU = 168	***	Selected	SSU = 50
PSU = 170	***	Selected	SSU = 50
PSU = 175	***	Selected	SSU = 50
PSU = 176	***	Selected	SSU = 50
PSU = 180	***	Selected	SSU = 50
PSU = 184	***	Selected	SSU = 50
PSU = 186	***	Selected	SSU = 53
PSU = 187	***	Selected	SSU = 50
PSU = 188	***	Selected	SSU = 50
PSU = 197	***	Selected	SSU = 50
PSU = 198	***	Selected	SSU = 50
PSU = 201	***	Selected	SSU = 58
PSU = 205	***	Selected	SSU = 50
PSU = 207	***	Selected	SSU = 50
PSU = 209	***	Selected	SSU = 50
PSU = 211	***	Selected	SSU = 50
PSU = 213	***	Selected	SSU = 50
PSU = 214	***	Selected	SSU = 131
PSU = 221	***	Selected	SSU = 104
PSU = 224	***	Selected	SSU = 50

PSU = 228	***	Selected	SSU = 239
PSU = 229	***	Selected	SSU = 50
PSU = 233	***	Selected	SSU = 50
PSU = 242	***	Selected	SSU = 50
PSU = 246	***	Selected	SSU = 50
PSU = 251	***	Selected	SSU = 50
PSU = 253	***	Selected	SSU = 50
PSU = 259	***	Selected	SSU = 756
PSU = 269	***	Selected	SSU = 50
PSU = 270	***	Selected	SSU = 50
PSU = 271	***	Selected	SSU = 50
PSU = 274	***	Selected	SSU = 50
PSU = 276	***	Selected	SSU = 50
PSU = 278	***	Selected	SSU = 50
PSU = 281	***	Selected	SSU = 50
PSU = 283	***	Selected	SSU = 50
PSU = 288	***	Selected	SSU = 50
PSU = 290	***	Selected	SSU = 50
PSU = 291	***	Selected	SSU = 50
PSU = 292	***	Selected	SSU = 50
PSU = 293	***	Selected	SSU = 50
PSU = 300	***	Selected	SSU = 50
PSU = 302	***	Selected	SSU = 50
PSU = 304	***	Selected	SSU = 60
PSU = 306	***	Selected	SSU = 50
PSU = 309	***	Selected	SSU = 72
PSU = 315	***	Selected	SSU = 50
PSU = 317	***	Selected	SSU = 50
PSU = 321	***	Selected	SSU = 50
PSU = 323	***	Selected	SSU = 50
PSU = 330	***	Selected	SSU = 207
PSU = 332	***	Selected	SSU = 50
PSU = 335	***	Selected	SSU = 50
PSU = 342	***	Selected	SSU = 57
PSU = 345	***	Selected	SSU = 50
PSU = 346	***	Selected	SSU = 50
PSU = 347	***	Selected	SSU = 50
PSU = 356	***	Selected	SSU = 50
PSU = 372	***	Selected	SSU = 50
PSU = 373	***	Selected	SSU = 50
PSU = 378	***	Selected	SSU = 50
PSU = 380	***	Selected	SSU = 50
PSU = 381	***	Selected	SSU = 50
PSU = 382	***	Selected	SSU = 152
PSU = 383	***	Selected	SSU = 50
PSU = 387	***	Selected	SSU = 50
PSU = 411	***	Selected	SSU = 50
PSU = 426	***	Selected	SSU = 50
PSU = 428	***	Selected	SSU = 50
PSU = 435	***	Selected	SSU = 50
PSU = 445	***	Selected	SSU = 114
PSU = 448	***	Selected	SSU = 50
PSU = 452	***	Selected	SSU = 50
PSU = 456	***	Selected	SSU = 50
PSU = 459	***	Selected	SSU = 50
PSU = 467	***	Selected	SSU = 50
PSU = 473	***	Selected	SSU = 50
PSU = 477	***	Selected	SSU = 50
PSU = 484	***	Selected	SSU = 50
PSU = 485	***	Selected	SSU = 50
PSU = 496	***	Selected	SSU = 113
PSU = 502	***	Selected	SSU = 50
PSU = 504	***	Selected	SSU = 50
PSU = 510	***	Selected	SSU = 50
PSU = 512	***	Selected	SSU = 50

```
-----  
Total PSU = 146  
Total SSU = 9579  
-----
```

```
In [42]: nrow(samp)  
sum(alloc2$alloc$ALLOC[-nrow(alloc2$alloc)])
```

9579

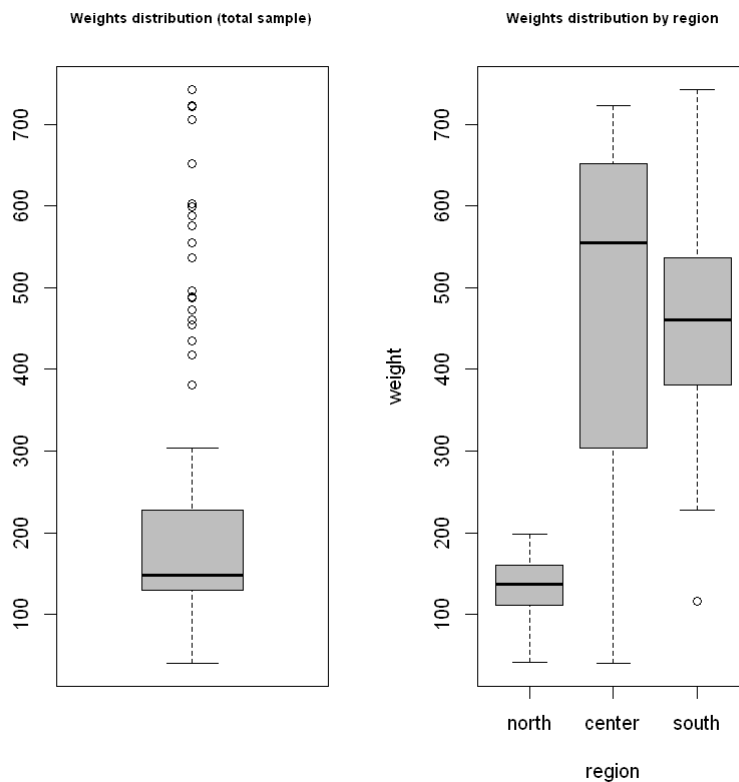
8396

```
In [43]: nrow(pop)  
sum(samp$weight)
```

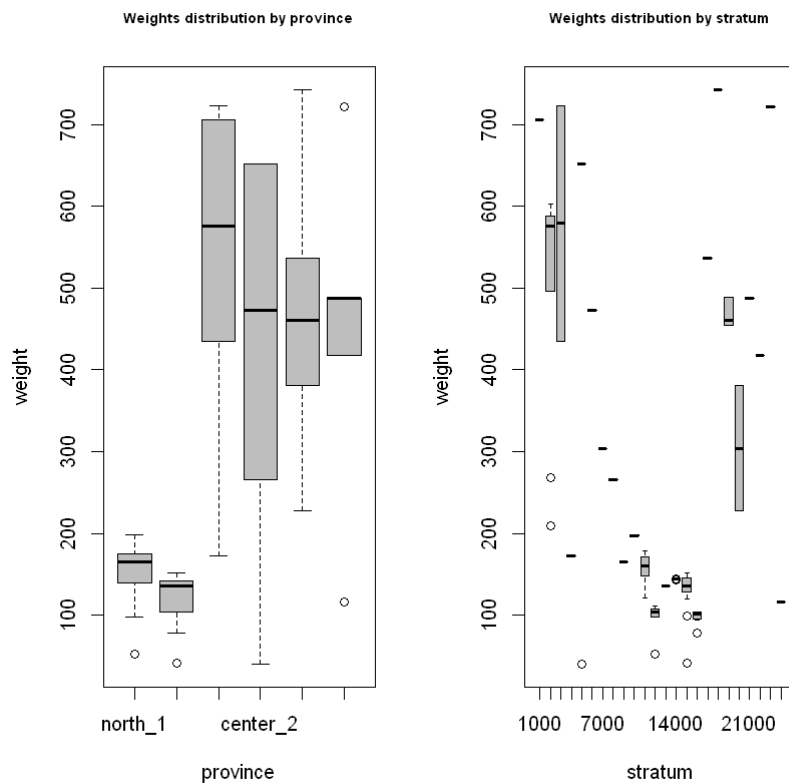
2258507

2258507

```
In [44]: ## Plot of weights distribution  
par(mfrow=c(1, 2))  
boxplot(samp$weight,col="grey")  
title("Weights distribution (total sample)",cex.main=0.7)  
boxplot(weight ~ region, data=samp,col="grey")  
title("Weights distribution by region",cex.main=0.7)  
par(mfrow=c(1, 2))  
boxplot(weight ~ province, data=samp,col="grey")  
title("Weights distribution by province",cex.main=0.7)  
boxplot(weight ~ stratum, data=samp,col="grey")  
title("Weights distribution by stratum",cex.main=0.7)
```







## Precision constraints compliance control (by simulation)

In [45]:

```
df=pop
df$one <- 1
PSU_code="municipality"
SSU_code="id_ind"
target_vars <- c("income_hh",
                  "active",
                  "inactive",
                  "unemployed")
```

In [46]:

```
# Domain level = national
domain_var <- "one"
set.seed(1234)
eval21 <- eval_2stage(df,
                      PSU_code,
                      SSU_code,
                      domain_var,
                      target_vars,
                      PSU_sampled=sample_1st$sample_PSU,
                      nsampl=100,
                      writeFiles=FALSE,
                      progress=TRUE)
eval21$coeff_var
```

|=====| 100%

A data.frame: 1 × 5

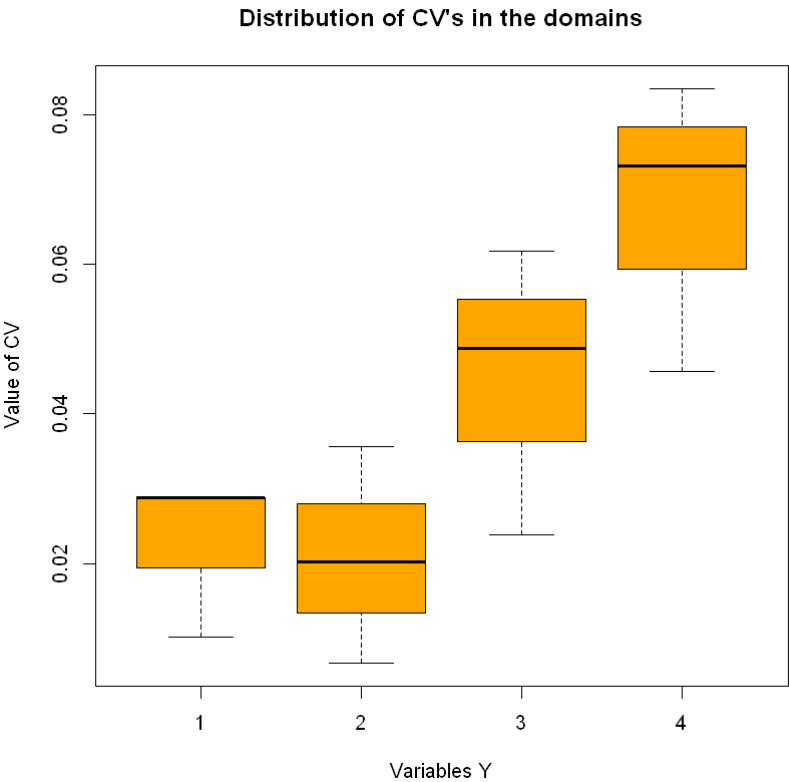
CV1	CV2	CV3	CV4	dom
<dbl>	<dbl>	<dbl>	<dbl>	<chr>
0.0126	0.0097	0.0252	0.0361	DOM1

In [47]:

```
# Domain level = regional
domain_var <- "region"
set.seed(1234)
eval22 <- eval_2stage(df,
  PSU_code,
  SSU_code,
  domain_var,
  target_vars,
  PSU_sampled=sample_1st$sample_PSU,
  nsampl=100,
  writeFiles=FALSE,
  progress=TRUE)

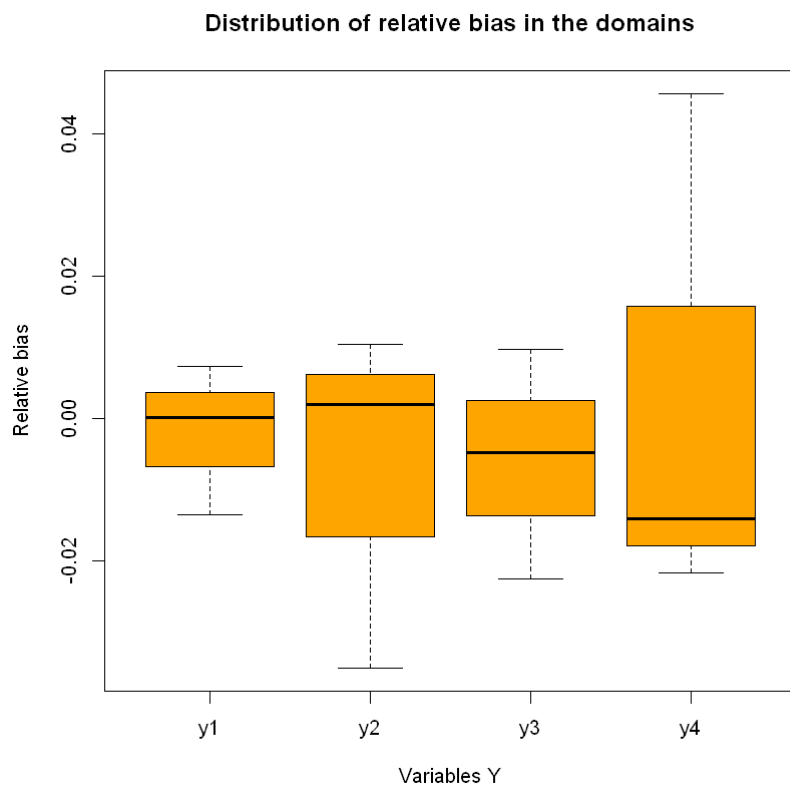
eval22$coeff_var
```

|=====| 100%



A data.frame: 3 × 5

CV1	CV2	CV3	CV4	dom
<dbl>	<dbl>	<dbl>	<dbl>	<chr>
0.0102	0.0067	0.0238	0.0835	DOM1
0.0287	0.0202	0.0488	0.0731	DOM2
0.0290	0.0357	0.0617	0.0457	DOM3



```
In [48]: alloc2$sensitivity
```

A data.frame: 4 × 6

	Type	Dom	V1	V2	V3	V4
	<chr>	<chr>	<dbl>	<dbl>	<dbl>	<dbl>
2	DOM1	1	1	1	1	1
6	DOM2	1	1	0	1	1273
10	DOM2	2	1	1	14	211
14	DOM2	3	114	1	66	1

```
In [ ]:
```