Overview of the package BuyseTest

Brice Ozenne

September 26, 2018

The **BuyseTest** package contains five functions that are relevant for the user:

- the BuyseTest function to compute the net benefit/win ratio. It is the main function of the package.
- a summary function to display the results computed by the BuyseTest function.
- a confint function to extract estimates, confidence intervals, and p.values.
- the getPairScore method to extract the contribution of each pair to the net benefit/win ratio.
- the BuyseTest.options function the contain the default values for the argument of the BuyseTest function. These default values can be changed to better match the user needs.

Two additional function are presented in this document: simBuyseTest that can be used to quickly simulate data and getSurvival that is useful to reproduce the results output by BuyseTest.

Before going further we need to load the **BuyseTest** package in the R session:

The **BuyseTest** package is under active development. Newer package versions may include additional functionnalities and fix previous bugs. To get the current version of the package use utils::packageVersion:

[1] '1.4.2'

1 Example data

For this overview we will used the ${\tt veteran}$ dataset from the ${\tt survival}$ package:

	trt	celltype	time	status	karno	diagtime	age	prior
1	1	squamous	72	1	60	7	69	0
2	1	squamous	411	1	70	5	64	10
3	1	squamous	228	1	60	3	38	0
4	1	squamous	126	1	60	9	63	10
5	1	squamous	118	1	70	11	65	10
6	1	squamous	10	1	20	5	49	0

See ?veteran for a presentation of the database.

2 Perforing generalized pairwise comparisons (GPC) using the BuyseTest function

To perform generalized pairwise comparisons, the BuyseTest function needs:

- an where the data are stored argument data
- the name of the endpoints argument endpoint
- the type of each endpoint argument type
- the variable defining the two treatment groups argument treatment

The BuyseTest function has many optional arguments to specify for example:

- the threshold associated to each endpoint (default= 10^{-12}) argument threhsold
- the censoring associated to each endpoint (for time to event endpoint) argument censoring
- how to compute the distribution of the statistic of interest argument method.inference

There are two equivalent ways to define the GPC:

• using a separate argument for each element¹:

```
Settings (point estimation)
```

- > treatment groups: Control = 1 and Treatment = 2
- > 1 endpoint:

```
priority endpoint type operator threshold censoring

time time to event higher is favorable 20 status
```

- > management of neutral pairs: re-analyzed using endpoints of lower priority (if any)
- > management of censored survival pairs: use Kaplan Meier survival curves to compute the score

Point estimation (done)

 $^{^{1}}$ we set the argument method.inference to "none" to diseable the computation of p-values and confidence intervals. This makes the execution of BuyseTest much faster.

- or via a formula interface. In the formula interface endpoint are wrapped by parentheses. The parentheses must be preceded by their type:
 - binary (b, bin, or binary)
 - continuous (c, cont, or continuous)
 - time to event (t, tte, or timetoevent)

Here we set in addition the argument trace to 0 to force the function to be silent (i.e. no display in the terminal). We can check that the two approaches are equivalent:

2.1 Displaying the results

The results of the GPC can be displayed using the summary method:

Generalized pairwise comparison with 1 prioritized endpoint

To display the number of pairs instead of the percentage of pairs that are favorable/unfavorable/neutral/uniformative, set the argument percentage to FALSE:

Generalized pairwise comparison with 1 prioritized endpoint

By default summary displays results relative to the statistic "net chance of a better outcome". To get results for the win ratio set the argument statistic to "winRatio":

Generalized pairwise comparison with 1 prioritized endpoint

Since we have set the argument n.permutation to 0 (i.e. no permutation test) in the stratified analysis, we do not get confidence intervals or p.values when calling the summary method.

2.2 Using multiple endpoints

More than one endpoint can be considered by indicating a vector of endpoints, types, and thresholds. In the formula interface, just add another endpoint at then end of the formula: The hierarchie of the endpoint is defined from left (most important endpoint, here time) to right (least important endpoint, here karno).

2.3 What if smaller is better?

By default BuyseTest will always assume that higher values of an endpoint are favorable. This behavior can be changed by specifying operator = "<0" for an endpoint:

```
endpoint threshold delta Delta time 20 0.0844 0.0844
```

Internally BuyseTest will multiply by -1 the values of the endpoint to ensure that lower values are considered as favorable. A direct consequence is that BuyseTest will not accept an endpoint with different operators:

```
Error in (function (alternative, name.call, censoring, correction.uninf, :

Cannot have different operator for the same endpoint used at different priorities
```

2.4 Stratified GPC

GPC can be performed for subgroups of a categorical variable

- argument strata

For instance, the celltype may have huge influence on the survival time and the investigator would like to only compare patients that have the same celltype. In the formula interface this is achieved by adding a single variable in the right hand side of the formula: The fact the it is not wrapped by bin, cont or tte indicates differentiate it from endpoint variables. When doing a stratified analysis, the summary method displays the global results as well as the results within each strata:

Generalized pairwise comparison with 2 prioritized endpoints and 4 strata

```
: net chance of a better outcome (delta: endpoint specific, Delta: global)
> statistic
> null hypothesis : Delta == 0
> treatment groups: 1 (control) vs. 2 (treatment)
> censored pairs : use Kaplan Meier survival curves to compute the score
> results
endpoint threshold
                               total favorable unfavorable neutral uninf
                                                                             delta
                                                                                      Delta
                       global 100.00
                                          36.06
                                                      45.77
                                                              17.50
                                                                      0.68 -0.0971 -0.0971
    time
                20
                    squamous
                               25.38
                                          14.33
                                                       8.77
                                                               2.28
                                                                      0.00 0.2193
                    smallcell
                               45.69
                                          12.69
                                                      20.88
                                                              11.44
                                                                      0.68 - 0.1792
                        adeno
                               13.71
                                          4.74
                                                       6.15
                                                               2.81
                                                                      0.00 - 0.1034
                        large
                               15.23
                                          4.30
                                                       9.97
                                                               0.96
                                                                      0.00 - 0.3722
   karno
             1e-12
                       global
                               18.17
                                          6.72
                                                       8.07
                                                               3.38
                                                                      0.00 -0.0135 -0.1106
                     squamous
                                2.28
                                          0.76
                                                       0.94
                                                               0.59
                                                                      0.00 -0.0071
                    smallcell
                               12.12
                                          4.33
                                                       5.75
                                                               2.03
                                                                      0.00 -0.0311
                        adeno
                                2.81
                                           1.46
                                                       0.85
                                                               0.51
                                                                      0.00 0.0448
                                                       0.54
                                                               0.25
                                                                      0.00 -0.0241
                        large
                                0.96
                                          0.17
```

Note that here the numbers in the favorable/unfavorable/neutral/uniformative columns are relative to the overall sample while the delta is only relative to the strata. The global delta is a sum of the strata specific delta weighted by the empirical proportion of pairs for each strata.

2.5 Stopping comparison for neutral pairs

In presence of neutral pairs, BuyseTest will, by default, continue the comparison on the endpoints with lower priority. For instance let consider a dataset with one observation in each treatment arm:

```
Id treatment tumor size

1: 1 Yes Yes 15

2: 2 No Yes 20
```

If we perform we GPC with tumor as the first endpoint and size as the second endpoint:

Generalized pairwise comparison with 2 prioritized endpoints

```
> statistic
                  : net chance of a better outcome (delta: endpoint specific, Delta: global)
> null hypothesis : Delta == 0
> treatment groups: No (control) vs. Yes (treatment)
> results
endpoint threshold total favorable unfavorable neutral uninf delta Delta
   tumor
               0.5
                      100
                                  0
                                              0
                                                     100
             1e-12
                     100
                                100
                                              0
                                                       0
                                                             0
                                                                   1
                                                                          1
    size
```

the outcome of the comparison is neutral for the first priority, but favorable for the second priority. If we set the argument neutral.as.uninf to FALSE, BuyseTest will stop the comparison when a pair is classified as neutral:

Generalized pairwise comparison with 2 prioritized endpoints

```
> statistic
                  : net chance of a better outcome (delta: endpoint specific, Delta: global)
> null hypothesis : Delta == 0
> treatment groups: No (control) vs. Yes (treatment)
> results
endpoint threshold total favorable unfavorable neutral uninf delta Delta
   tumor
               0.5
                      100
                                  0
                                              0
                                                     100
                        0
                                  0
                                              0
                                                       0
                                                             0
                                                                   0
                                                                          0
    size
             1e-12
```

So in this case no pair is analyzed at second priority.

2.6 What about p-value and confidence intervals?

P-values can be estimated via a permutation test:

Generalized pairwise comparison with 1 prioritized endpoint

```
> statistic : net chance of a better outcome (delta: endpoint specific, Delta: global)
> null hypothesis : Delta == 0
> permutation test: 10 samples, confidence level 0.95
> treatment groups: 1 (control) vs. 2 (treatment)
> censored pairs : use Kaplan Meier survival curves to compute the score
> results
endpoint threshold total favorable unfavorable neutral uninf delta Delta
```

```
time 20 100 37.78 46.54 15.68 0 -0.0877 -0.0877 CI [2.5; 97.5] p.value [-0.2412; 0.1946] 0.4
```

 ${\tt NOTE:}$ confidence intervals computed under the null hypothesis

The argument n.resampling indicates the permutation that will be performed. We set it to 10 to save computation time but to obtain reliable p-value/confidence intervals, n.resampling should be at least 1000. The validity of the confidence intervals obtained via a permutation test is questionnable and we recommand instead to use a bootstrap approach for estimating confidence intervals. To do so, set the argument method.inference to "bootstrap" when calling BuyseTest:

Generalized pairwise comparison with 1 prioritized endpoint

```
> statistic
                  : net chance of a better outcome (delta: endpoint specific, Delta: global)
> null hypothesis : Delta == 0
> bootstrap resampling: 10 samples, confidence level 0.95
> treatment groups: 1 (control) vs. 2 (treatment)
> censored pairs : use Kaplan Meier survival curves to compute the score
> results
endpoint threshold total favorable unfavorable neutral uninf
                                                                delta
                                                                        Delta
                20
                     100
                             37.78
                                         46.54
                                                 15.68
                                                           0 -0.0877 -0.0877
 CI [2.5; 97.5] p.value
[-0.1794;0.0302]
                     0.5
```

3 Getting additional inside: looking at the pair level

So far we have looked at the overall score and probabilities. But it is also possible to extract the score relative to each pair, as well as to "manually" compute this score. This can give further inside on what the sofware is actually doing and what is the contribution of each individual on the evaluation of the treatment.

3.1 Extracting the contribution of each pair to the statistic

The net chance of better outcome or the win ratio statistics can be expressed as a sum of a score over all pairs of patients. The argument keep.pairScore enables to export the score relative to each pair in the output of BuyseTest: The method getPairScore can then be used to extract the contribution of each pair. For instance the following code extracts the contribution for the first endpoint:

	strata	index.1	index.2	favorable	unfavorable	neutral	${\tt uninformative}$	weight
1:	1	1	70	1	0	0	0	1
2:	1	2	70	1	0	0	0	1
3:	1	3	70	1	0	0	0	1
4:	1	4	70	1	0	0	0	1
5:	1	5	70	1	0	0	0	1
4688:	1	65	137	0	1	0	0	1
4689:	1	66	137	0	1	0	0	1
4690:	1	67	137	0	1	0	0	1
4691:	1	68	137	0	1	0	0	1
4692:	1	69	137	0	1	0	0	1
	favoral	ole.corre	ected unf	avorable.	corrected new	ıtral.co	rrected	
1:			1		0		0	
2:			1		0		0	
3:			1		0		0	
4:			1		0		0	
5:			1		0		0	
4688:			0		1		0	
4689:			0		1		0	
4690:			0		1		0	
4691:			0		1		0	
4692:			0		1		0	

Each line corresponds to different comparison between a pair from the control arm and the treatment arm. The column strata store to which strata the pair belongs (first, second, ...). The columns favorable, unfavorable, neutral, uninformative contains the result of the comparison, e.g. the first pair was classified as favorable while the last was classified as favorable with a weight of 1. The second and third columns indicates the rows in the original dataset corresponding to the pair:

	trt	celltype	time	status	karno	diagtime	age	prior
70	2	squamous	999	1	90	12	54	10
1	1	squamous	72	1	60	7	69	0

For the first pair, the event was observed for both observations and since 999 > 72 + 20 the pair is rated favorable. Substracting the average probability of the pair being favorable minus the average probability of the pair being unfavorable:

[1] -0.08765836

gives the net benefit in favor of the treatment for the first endpoint:

```
endpoint threshold delta Delta
time 20 -0.0877 -0.0877
karno 1e-12 -0.0133 -0.1009
```

More examples and explaination can be found in the documentation of the method getPairScore.

3.2 Extracting the survival probabilities

When using method.tte equals "Peron", survival probabilities at event time, and event times +/threshold in the control and treatment arms are used to score the pair. Setting keep.survival to
TRUE in BuyseTest.options enables to export the survival probabilities in the output of BuyseTest:
The method getSurvival can then be used to extract these survival probabilities. For instance the
following code extracts the survival for the first endpoint:

```
List of 5
 $ survTimeC: num [1:69, 1:7] 72 411 228 126 118 10 82 110 314 100 ...
  ..- attr(*, "dimnames")=List of 2
  ....$ : NULL
  ....$ : chr [1:7] "time" "SurvivalC-threshold" "SurvivalC_0" "SurvivalC+threshold" ...
 $ survTimeT: num [1:68, 1:7] 999 112 87 231 242 991 111 1 587 389 ...
  ..- attr(*, "dimnames")=List of 2
  .. ..$ : NULL
  ....$ : chr [1:7] "time" "SurvivalC-threshold" "SurvivalC_0" "SurvivalC+threshold" ...
 $ survJumpC: num [1:57, 1:3] 3 4 7 8 10 11 12 13 16 18 ...
  ..- attr(*, "dimnames")=List of 2
  ....$ : NULL
  ....$ : chr [1:3] "time" "survival" "dSurvival"
 $ survJumpT: num [1:51, 1:3] 1 2 7 8 13 15 18 19 20 21 ...
  ..- attr(*, "dimnames")=List of 2
  .. ..$ : NULL
  ....$ : chr [1:3] "time" "survival" "dSurvival"
 $ lastSurv : Named num [1:2] 0 0
  ..- attr(*, "names")= chr [1:2] "Control" "Treatment"
```

3.2.1 Computation of the score with only one censored event

Let's look at pair 91:

```
strata index.1 index.2 indexWithinStrata.1 indexWithinStrata.2 favorable unfavorable

1: 1 22 71 22 2 0 0.6950827

neutral uninformative weight favorable.corrected unfavorable.corrected
```

1: 0.3049173 0 1 0 0.6950827 neutral.corrected 1: 0.3049173

In the dataset this corresponds to:

trt celltype time status karno diagtime age prior 22 1 smallcell 97 0 60 5 67 0 71 2 squamous 112 1 80 6 60 0

The observation from the control group is censored at 97 while the observation from the treatment group has an event at 112. Since the threshold is 20, and (112-20)<97, we know that the pair is not in favor of the treatment. The formula for probability in favor of the control is $\frac{S_c(97)}{S_c(112+20)}$. The survival at the event time in the censoring group is stored in survTimeC. Since observation 22 is the 22th observation in the control group:

time SurvivalC-threshold SurvivalC_0 SurvivalC+threshold 97.0000000 0.5615232 0.5171924 0.4235463 SurvivalT-threshold SurvivalT_0 SurvivalT+threshold 0.4558824 0.3643277 0.2827500

Since we are interested in the survival in the control arm exactly at the event time:

SurvivalC_0 0.5171924

The survival at the event time in the treatment group is stored in survTimeC. Since observation 71 is the 2nd observation in the treatment group:

Since we are interested in the survival in the control arm at the event time plus threshold:

SurvivalC+threshold 0.3594915

The probability in favor of the control is then:

SurvivalC+threshold 0.6950827

3.2.2 Computation of the score with two censored events

When both observations are censored, the formula for computing the probability in favor of treatment or control involves an integral. This integral can be computed using the function calcIntegralProba_cpp that takes as argument a matrix containing the survival and the jumps in survival, e.g.:

time survival dSurvival

- [1,] 1 0.7681159 -0.02941176
- [2,]2 0.7536232 -0.01470588
- [3,] 7 0.7388463 -0.02941176
- [4,]8 0.7388463 -0.02941176
- [5,] 13 0.7092924 -0.01470588
- [6,] 15 0.6945155 -0.02941176

and the starting time of the integration time. For instance, let's look at pair 148:

strata index.1 index.2 indexWithinStrata.1 indexWithinStrata.2 favorable unfavorable 1: 10 3 0.5058685 0.3770426 10

neutral uninformative weight favorable.corrected unfavorable.corrected

1: 0.1170889 1 0.5058685 0.3770426

neutral.corrected

0.1170889 1:

which corresponds to the observations:

trt celltype time status karno diagtime age prior

- 1 squamous 100 70 6 70
- 80 3 48 72 2 squamous 87 0

The probability in favor of the treatment (p_F) and control (p_{UF}) can be computed as:

$$p_F = -\frac{1}{S_T(x)S_C(y)} \int_{t>y} S_T(t+\tau)dS_C(t)$$

$$p_{UF} = -\frac{1}{S_T(x)S_C(y)} \int_{t>x} S_C(t+\tau)dS_T(t)$$

$$p_{UF} = -\frac{1}{S_T(x)S_C(y)} \int_{t>x} S_C(t+\tau) dS_T(t)$$

where x = 87 and y = 100. We obtain:

favorable unfavorable

0.5058685 0.3770426

4 Dealing with missing values or/and right censoring

In presence of censoring or missing values, some pairs may be classified as uninformative. This may bias the estimate of the net net benefit. Two corrections are currently proposed to correct this bias.

To illustrate the effect of these correction, we will use the following dataset:

	Treatment	toxicity	eventtimeUncensored	eventtimeCensoring	eventtime	status	status1
1:	C	0	0.1588268	2.6268101	0.1588268	1	1
2:	C	1	1.7204676	0.2000192	0.2000192	0	1
3:	C	1	0.4900490	0.5747995	0.4900490	1	1
4:	C	0	0.1138545	1.5188001	0.1138545	1	1
5:	C	1	0.5191035	3.8340048	0.5191035	1	1
6:	C	0	0.9405830	1.9078657	0.9405830	1	1

where we have the uncensored event times as well as the censored event times. The percentage of censored observations is:

[1] 0.317

We would like to be able to recover the net benefit estimated with the uncensored event times:

```
endpoint threshold delta Delta
eventtimeUncensored 1 0.2401 0.2401
using the censored survival times:
endpoint threshold delta Delta
eventtime 1 0.1363 0.1363
```

As we can see on this example, the net benefit is shrunk toward 0.

4.0.1 Inverse probability-of-censoring weights (IPCW)

With IPCW the weights of the non-informative pairs is redistributed to the informative pairs. This is only a good strategy when there are no neutral pairs or there are no lower priority endpoints. This gives an estimate much closer to the true net benefit:

Generalized pairwise comparison with 1 prioritized endpoint

```
> statistic : net chance of a better outcome (delta: endpoint specific, Delta: global)
> null hypothesis : Delta == 0
> treatment groups: C (control) vs. T (treatment)
> censored pairs : uninformative pairs
> uninformative pairs: no contribution, their weight is passed to the informative pairs using IPC
> results
  endpoint threshold total favorable unfavorable neutral uninf delta Delta
eventtime    1 100 37.11 12.34 50.54 0 0.2477 0.2477
```

We can also see that no pair is finally classified as non informative. To get some inside about the correction we can look at the scores of the pairs: To get a synthetic view, we only look at the unique favorable/unfavorable/neutral/uniformative results:

	${\tt favorable}$	unfavorable	neutral	uninformativ	e strata	index.C	index.T	weight
1:	0	0	1		0 1	1	501	1
2:	0	0	0		1 1	2	501	1
3:	0	1	. 0		0 1	10	501	1
4:	1	0	0		0 1	1	504	1
	favorable	.corrected u	nfavorab	le.corrected	neutral.	corrected	i	
1:		0.00000		0.00000		1.81657	7	
2:		0.00000		0.00000		0.00000)	
3:		0.00000		1.81657		0.00000)	
4:		1.81657		0.00000		0.00000)	

We can see that the favorable/unfavorable/neutral pairs have seen their contribution multiplied by:

[1] 1.81657

i.e. the inverse probability of being informative.

4.0.2 Correction at the pair level

Another possible correction is to distribute the non-informative weight of a pair to the average favorable/unfavorable/neutral probability observed on the sample:

Generalized pairwise comparison with 1 prioritized endpoint

Looking at the scores of the pairs:

	favorable u	unfavorable	neutral	uninformative	strata	${\tt index.C}$	${\tt index.T}$	weight	
1:	0	0	1	0	1	1	501	1	
2:	0	0	0	1	1	2	501	1	
3:	0	1	0	0	1	10	501	1	
4:	1	0	0	0	1	1	504	1	
	favorable.	corrected u	nfavorab]	le.corrected n	eutral.	corrected	i		
1:		0.00000		0.0000000	:	1.0000000)		
2:		0.371118		0.1234396	(0.5054424	1		

3:	0.00000	1.000000	0.0000000	
4:	1.000000	0.0000000	0.0000000	
	we can see that the correc	ted probability have not c	hanged for the inform	native pairs but

we can see that the corrected probability have not changed for the informative pairs, but for the non-informative they have been set to:

```
favorable unfavorable neutral
1: 0.371118 0.1234396 0.5054424
```

5 Simulating data using simBuyseTest

You can simulate data with the **simBuyseTest** function. For instance the following code simulates data for 5 individuals in the treatment arm and 5 individuals in the control arm:

```
Treatment toxicity
                               score eventtime status
            C
                                                      0
1:
                          0.54361539 1.8252132
            C
2:
                      1 -0.70762484 2.9489056
                                                      1
            C
                      1 -0.36944577 0.7213402
                                                      0
3:
            С
                      1 -1.32197565 0.6322603
                                                      1
4:
5:
            C
                          1.28059746 0.2212117
                                                      0
            Т
                          0.01874617 0.1453481
                                                      0
6:
7:
            Τ
                      1 -0.18425254 0.4855601
                                                      0
8:
            Τ
                      0 -1.37133055 0.2547505
                                                      0
9:
            Т
                      1 -0.59916772 1.0340368
                                                      0
10:
            Τ
                         0.29454513 0.3579324
                                                      1
```

By default a categorical, continuous and time to event outcome are generated independently. You can modify their distribution via the arguments argsBin, argsCont, argsTTE. For instance the following code simulates two continuous variables with mean 5 in the treatment arm and 10 in the control arm all with variance 1:

```
Treatment toxicity tumorSize
                                       score eventtime status
1:
                         9.010394 10.667415 0.2729620
2:
            C
                         9.965152 11.691755 0.5562477
                                                              0
            C
3:
                      0 10.847160 10.001261 0.8040608
                                                              0
4:
            C
                       11.525498
                                    9.257539 1.8477048
                                                              1
            C
                         9.932625 10.609684 0.3639572
5:
                      1
                                                              1
            Т
                      1
                         5.389794
                                    5.018746 0.6243732
                                                              0
6:
7:
            Т
                      1
                         3.791924
                                    4.815747 0.3527879
                                                              1
8:
            Τ
                         4.636324
                                    3.628669 1.7731161
                                                              0
                      1
9:
            Τ
                      0
                         3.373327
                                    4.400832 0.1055467
                                                              0
10:
            Τ
                         4.743522
                                    5.294545 0.8612402
                                                              0
```

This functionality is based on the sim function of the lava package (https://github.com/kkholst/lava)

6 Modifying default options

The <code>BuyseTest.options</code> method enable to get and set the default options of the <code>BuyseTest</code> function. For instance, the default option for trace is:

\$trace

[1] 2

To change the default option to 0 (i.e. no output) use: To restore the original default options do:

7 Information about the R session used for this document

```
R version 3.4.0 (2017-04-21)
Platform: x86_64-w64-mingw32/x64 (64-bit)
Running under: Windows 7 x64 (build 7601) Service Pack 1
Matrix products: default
locale:
[1] LC_COLLATE=Danish_Denmark.1252 LC_CTYPE=Danish_Denmark.1252
[3] LC_MONETARY=Danish_Denmark.1252 LC_NUMERIC=C
[5] LC_TIME=Danish_Denmark.1252
attached base packages:
[1] stats
             graphics grDevices utils
                                           datasets methods base
other attached packages:
[1] BuyseTest_1.4.2
                     data.table_1.11.4 Rcpp_0.12.17
                                                         prodlim_1.6.1
loaded via a namespace (and not attached):
 [1] lattice_0.20-35
                       grid_3.4.0
                                          R6_2.2.1
                                                             stats4_3.4.0
                                                             testthat_2.0.0
 [5] magrittr_1.5
                       KernSmooth_2.23-15 rlang_0.2.0
 [9] Matrix_1.2-9
                                          splines_3.4.0
                                                             tools_3.4.0
                       lava_1.6.1
[13] survival_2.41-3 parallel_3.4.0 compiler_3.4.0
```