Package 'MSPRT'

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Title A Modified Sequential Probability Ratio Test (MSPRT)

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Description

A modified SPRT (MSPRT) can be designed and implemented with the help of this package. In a MSPRT design, (i) the maximum sample size of an experiment is fixed prior to the start of an experiment; (ii) the alternative hypothesis used to define the rejection region of the test is derived from the size of the test (Type I error), the maximum available sample size (N), and (iii) the targeted Type 2

error (equals to 1 minus the power) is also prespecified. Given these values, the MSPRT is defined in a

manner very similar to Wald's initial proposal. This test can reduce the average sample size required to

perform statistical hypothesis tests at the specified level of significance and power. This package implements one-sample proportion tests, one-sample Z-tests, one-sample T-tests, two-sample Z-tests and two-sample T-tests. A user guidance for this package is provided here. One can also refer to the supplemental information for the same.

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MSPRT-package

A Modified Sequential Probability Ratio Test (MSPRT)

Description

A modified SPRT (MSPRT) can be designed and implemented with the help of this package. In a MSPRT design, (i) the maximum sample size of an experiment is fixed prior to the start of an experiment; (ii) the alternative hypothesis used to define the rejection region of the test is derived from the size of the test (Type I error), the maximum available sample size (N), and (iii) the targeted Type 2 error (equals to 1 minus the power) is also prespecified. Given these values, the MSPRT is defined in a manner very similar to Wald's initial proposal. This test can reduce the average sample size required to perform statistical hypothesis tests at the specified level of significance and power. This package implements one-sample proportion tests, one-sample Z-tests, one-sample T-tests, twosample Z-tests and two-sample T-tests. A user guidance for this package is provided here. One can also refer to the supplemental information for the same.

Details

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check

Sequential checking

Description

This compares a sequence of values with two sequences of thresholds, namely upper and lower thresholds. At any step, it rejects if the value gets larger than the upper threshold, accepts if it becomes smaller than the lower threshold, and remains inconclusive if it stays in between until the end. If it stays inconclusive at the last step, this function compares the last value with the termination threshold. If the value is larger than the termination threshold, it rejects; otherwise, it accepts.

As a particular case, this function sequentially checks the likelihood ratios with the upper, lower and termination thresholds according to the MSPRT algorithm (Algorithm 1 in the supplemental file).

This function can be readily adapted to Group sequential designs by specifying batch.seq (in one-sample tests), and batch1.seq & batch2.seq (in two-sample tests) accordingly.

Usage

test.type	a character; denotes the type of test;
	"oneProp" for a one-sample proportion test
	"oneZ" for a one-sample Z-test
	"oneT" for a one-sample T-test
	"twoZ" for a two-sample Z-test
	"twoT" for a two-sample T-test
statistic	a numeric vector; contains a sequence of values which we want to compare.
	In particular for the MSPRT, this is a vector of sequentially calculated likelihood ratios (L_n) .
	It's length should not exceed the length of batch.seq in one-sample tests, and length of batch1.seq (or batch2.seq) in two-sample tests.
upper	a numeric vector; the sequence of upper threshold.
	It's length should be equal to the length of batch.seq in one-sample tests, and length of batch1.seq (or batch2.seq) in two-sample tests.
lower	a numeric vector; the sequence of lower threshold.
	It's length should be equal to the length of batch.seq in one-sample tests, and length of batch1.seq (or batch2.seq) in two-sample tests.
batch.seq	a numeric vector; required only in one-sample tests.
	an increasing sequence of sample size values where data are supposed to be observed sequentially
batch1.seq	a numeric vector; required only in two-sample tests.
	an increasing sequence of sample size values where data from Group-1 are supposed to be observed sequentially
batch2.seq	a numeric vector; required only in two-sample tests.
	an increasing sequence of sample size values where data from Group-2 are supposed to be observed sequentially
threshold	a positive numeric; the termination threshold in a MSPRT.

compmerge.list

Details

Suppose in a one-sample test, we can affrod at most 100 samples and observe the data after every sample. In this case, the batch.seq will be 1:100.

In another scenario, suppose we observe the data in groups at every 10th sample. In this case, the batch.seq will be seq(from=10,to=100,by=10). So there are at most 10 batches/steps where we can observe the data and compare.

Once the L_n 's, the upper and lower thresholds, and the termination threshold are provided, this function implements the Algorithm 1 in the supplemental file.

Value

In one-sample tests, this returns a list containing the following elements:

decision	a character; the final decision that is made.
	Either "accept", "reject" or "continue".
n	a numeric (positive integer); number of samples needed for reaching the decision
exit.stage	a numeric (positive integer); the step where the decision was reached at

In two-sample tests this returns a similar list as above, except now n is replaced by n1 & n2 having the following descriptions:

n1	a numeric (positive integer); number of samples needed from Group-1 for reaching the decision
n2	a numeric (positive integer); number of samples needed from Group-2 for reaching the decision

Author(s)

Sandipan Pramanik, Valen E. Johnson and Anirban Bhattacharya

compmerge.list Merging two lists componentwise

Description

Suppose two lists have same number of components. This function creates a new list by merging (or concatenating) them componentwise.

Usage

compmerge.list(11, 12)

11	a list
12	a list

11 and 12 need to have same number of components.

Value

Returns the merged list.

Author(s)

Sandipan Pramanik, Valen E. Johnson and Anirban Bhattacharya

Examples

list1 = list("a"=1, "b"=3, "c"=5) list2 = list("a"=2, "b"=4, "c"=6)

compmerge.list(list1, list2)

design.MSPRT

Designing a MSPRT

Description

Given the desired values of Type 1 & Type 2 error probabilities and the maximum available number of samples (N), this function designs the MSPRT (by finding the 'Termination Threshold' γ). γ is the smallest possible value so that the Type 1 error of the MSPRT is maintained at the desired level. This function designs the MSPRT for one-sample proportion tests, one-sample Z and T-tests, and two-sample Z and T-tests.

By default (that is, if alt.comp is missing or FALSE) this provides the operating characteristics (OC) for the obtained MSPRT at the null hypothesized value. Otherwise, this also finds the OC at a user desired point alternative. This point alternative is specified through alt.comp.

In general, OC.MSPRT() can also be used to find the OC of the MSPRT at any desired parameter value.

Usage

```
design.MSPRT(test.type, side, batch.seq, batch1.seq, batch2.seq,
    type1 = 0.005, type2 = 0.2, null, sigma0 = 1,
    N.max, N1.max, N2.max, alt.comp, repl,
    verbose = T, core.no)
```

design.MSPRT

test.type	a character; denotes the type of test. "oneProp" for a one-sample binomial proportion test.
	"oneZ" for a one-sample Z-test.
	"oneT" for a one-sample T-test.
	"twoZ" for a two-sample Z-test.
	"twoT" for a two-sample T-test.
side	a character; direction of the alternative hypothesis H1.
	Has to be one of "right" or "left".
	Default: "right".
batch.seq	a numeric vector; required only in one-sample tests. Sizes of sequentially observed batches in a group sequential design.
	Required only if the design is group sequential, that is when data are observed in batches. Otherwise, only need to provide N.max.
batch1.seq	a numeric vector; required only in two-sample tests. Sizes of sequentially observed batches from Group-1 in a group sequential design.
	Required only if the design is group sequential, that is when data from Group-1 are observed in batches. Otherwise, only need to provide N1.max.
batch2.seq	a numeric vector; required only in two-sample tests. Sizes of sequentially observed batches from Group-2 in a group sequential design.
	Required only if the design is group sequential, that is when data from Group-2 are observed in batches. Otherwise, only need to provide N2.max.
type1	a numeric in (0,1); the probability at which we want to control the Type 1 error of the MSPRT.
	Default: 0.005.
type2	a numeric in (0,1); the probability at which we want to control the Type 2 error of the MSPRT.
	Default: 0.2.
null	a numeric; required only in one-sample proportion and Z-tests. Denotes value of the hypothesized parameter under the null hypothesis.
	The hypothesized parameters are proportion in one-sample binomial proportion test, population mean in one-sample Z & T-tests, and difference between the population means of Group-2 and Group-1 in two-sample Z & T-tests.
	In one-sample T-tests and two-sample tests, only null=0 is allowed. This is done automatically. This argument is ignored in these cases.
	Default: 0.5 in one-sample binomial proportion test, and 0 in one-sample Z-tests.
sigma0	a positive numeric; required only in one & two-sample Z-tests. Known population standard deviation in one-sample tests and known common population standard deviation in two-sample tests.
	Default: 1.

N.max	a positive numeric (integer); required only in one-sample tests. Maximum number of samples that we can afford in the one-sample test.
	In a group sequential design, this should be equal to sum(batch.seq). So in that case, it's enough to provide only batch.seq and not N.max.
N1.max	a positive numeric (integer); required only in two-sample tests. Maximum number of samples from Group-1 that we can afford in the two-sample test.
	In a group sequential design, this should be equal to sum(batch1.seq). So in that case, it's enough to provide only batch1.seq and not N1.max.
N2.max	a positive numeric (integer); required only in two-sample tests. Maximum number of samples from Group-2 that we can afford in the two-sample test. In a group sequential design, this should be equal to sum(batch2.seq). So in that case, it's enough to provide only batch2.seq and not N2.max.
alt.comp	missing, FALSE or TRUE, or a numeric;
	If missing or FALSE, the OC of the MSPRT are obtained only at the null;
	If TRUE, the OC of the MSPRT are computed at the null and the 'fixed design alternative';
	If a numeric, it can be any value under the alternative (consistent with the "side"). Then OC of the MSPRT are obtained at the null and this point.
repl	a positve numeric (integer); total number of replications to be used in Monte Carlo method to calculate the OC of the MSPRT.
	Default (Recommended): 2e+6 in a one-sample proportion test; 1e+6 otherwise. Should be at least 1e+5.
verbose	a logical; if TRUE, returns messages of the current proceedings; otherwise it doesn't.
	Default: TRUE.
core.no	a numeric; number of cores this function can use for carrying out a parallel computation.
	Default: 1 if there are at most 2 cores, otherwise (number of cores -1).

Details

In two-sample tests, the hypothesized parameter is (population mean of Group-2 - population mean of Group-1). So null=0 implies that these two means are equal under the null hypothesis; side="right" implies that the population mean of Group-2 is larger under this alternative hypothesis; side="left" implies that the population mean of Group-1 is larger under this alternative hypothesis.

For a user guide, please refer to the supplemental information.

Value

Let us first look at the outputs in one-sample tests.

If alt.comp is missing or FALSE (default), this computes the OC of the obtained MSPRT under the null hypothesis, and returns a list with the following components:

type1.est a numeric in (0, 1); the Type 1 error probability of the MSPRT.

avg.n0	a positive numeric; the number of samples required on an average by the MSPRT for coming to a decision when the null hypothesis is true.
umpbt.alt	a numeric or a numeric vector of length 2;
	In one-sample proportion tests, this is usually of length 2. They specify the two points of the UMPBT alternative.
	In one & two-sample Z-tests, this is the UMPBT point alternative.
	In one & two-sample T-tests, this is not returned.
psi.umpbt	a numeric in $(0,1)$; returned only in case of one-sample proportion tests. This denotes the probability of the first component in umpbt.alt.
rej.threshold	a numeric; the constant value of Wald's rejection threshold.
acc.threshold	a numeric; the constant value of Wald's acceptance threshold.
term.thresh	a positive numeric; denotes the Termination Threshold (γ) of a MSPRT.

If alt.comp equals TRUE, this additionally computes the OC of the obtained MSPRT at the 'fixed design alternative'. In this case, the function returns a list with the following components in addition to the previously mentioned components:

type2.est	a numeric in $(0,1)$; the Type 2 error probability of the obtained MSPRT at the alternative.
avg.n1	a positive numeric; the number of samples required on an average by the MSPRT for coming to a decision when the alternative is true.
alt	a numeric; the point alternative where the performance is computed. In this case, this is the 'fixed design alternative'.
alt.type2	a numeric in $(0,1)$; the Type 2 error probability of the fixed design test at alt. In this case this is exactly type2.

If alt.comp is numeric, then this computes the list exactly it was for alt.comp = TRUE with type2.est, avg.n1, alt and alt.type2 now computed at this user specified value.

In two-sample tests we get similar outputs as in one-sample tests above, except avg.n0 and avg.n1 is replaced by avg.n1_0, avg.n2_0 and avg.n1_1, avg.n2_1, respectively.

avg.n1_0	a positive numeric; the number of samples from Group-1 required on an average by the MSPRT for coming to a decision when the null hypothesis is true.
avg.n2_0	a positive numeric; the number of samples from Group-2 required on an average by the MSPRT for coming to a decision when the null hypothesis is true.
avg.n1_1	a positive numeric; the number of samples from Group-1 required on an average by the MSPRT for coming to a decision when the alternative hypothesis is true.
avg.n2_1	a positive numeric; the number of samples from Group-2 required on an average by the MSPRT for coming to a decision when the alternative hypothesis is true.

Author(s)

Sandipan Pramanik, Valen E. Johnson and Anirban Bhattacharya

References

MSPRT: Main article and Supplemental file

Johnson, Valen E., Uniformly most powerful Bayesian tests., Ann. of Stat., 41, (4), 2013, pp. 1716-1741

Johnson, Valen E., Revised standards for statistical evidence., Proceedings of the National Academy of Sciences, 16, 1945.

Daniel J. Benjamin, James O. Berger, Magnus Johannesson, et al. Redefine statistical significance. Nature Human Behaviour, 2017.

Examples

right-sided one-sample proportion test

```
# can observe data after each sample sequentially. Max available
# sample size is 30
# design.MSPRT(test.type="oneProp", null = 0.2, N.max = 30)
```

```
# can observe data at every fifth sample sequentially. Max available
# sample size is 30. So there are 6 batches each of size 5.
# design.MSPRT(test.type="oneProp", null = 0.2, N.max = 30,
# batch.seq = rep(5,6))
```

right-sided one-sample Z-test

```
# can observe data after each sample sequentially. Max available
# sample size is 30
# design.MSPRT(test.type="oneZ", null = 3, sigma0 = 1.5,
# N.max = 30)
```

```
# can observe data at every fifth sample sequentially. Max available
# sample size is 30. So there are 6 batches each of size 5.
# design.MSPRT(test.type="oneZ", null = 3, sigma0 = 1.5,
# N.max = 30, batch.seq = rep(5,6))
```

```
## right-sided one-sample T-test
```

```
# can observe data after each sample sequentially. Max available
# sample size is 30
# design.MSPRT(test.type="oneT", N.max = 30)
```

```
# can observe data at every fifth sample sequentially. Max available
# sample size is 30. So there are 6 batches each of size 5.
# design.MSPRT(test.type="oneT", N.max = 30, batch.seq = rep(5,6))
```

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```
## right-sided two-sample Z-test
# can observe data after each sample for each group sequentially.
# Max available sample size is 30 for both groups
# design.MSPRT(test.type="twoZ", sigma0 = 1.5, N1.max = 30, N2.max = 30)
# can observe data at every fifth sample for each group sequentially.
# Max available sample size is 30 for both groups. So there are 6 batches
# each of size 5 for each group.
# design.MSPRT(test.type="twoZ", sigma0 = 1.5,
               batch1.seq = rep(5,6), batch2.seq = rep(5,6),
#
#
              N1.max = 30, N2.max = 30)
## right-sided two-sample T-test
# can observe data after each sample for each group sequentially.
# Max available sample size is 30 for both groups
# design.MSPRT(test.type="twoT", N1.max = 30, N2.max = 30)
# can observe data at every fifth sample for each group sequentially.
# Max available sample size is 30 for both groups. So there are 6 batches
# each of size 5 for each group.
# design.MSPRT(test.type="twoT", N1.max = 30, N2.max = 30,
              batch1.seq = rep(5,6), batch2.seq = rep(5,6))
#
```

effective.N

Determining the 'effective maximum sample size' in MSPRT for onesample proportion tests

Description

Because of the discreteness issue in one-sample proportion tests, it is not always 'effective' (the sense is explained in the Details section) to use just any value as a maximum sample size for designing a MSPRT. Suppose, we have a desired value for the maximum sample size. Given this, the function finds a value, defined as the effective maximum sample size, which should be used as the maximum sample size for designing the MSPRT (as N.max in design.MSPRT()).

Usage

```
effective.N(N, side = "right", type1 = 0.005, null = 0.5, plot.it = T)
```

Arguments

Ν	a numeric; a desired value of the maximum sample size for designing the MSPRT.
side	a character; direction of the alternative hypothesis H1.
	Has to be one of right or left.
	Default. Fight .
type1	a numeric in $(0, 1)$; the probability at which we want to control the Type 1 error of the MSPRT.
	Default: 0.005.
null	a numeric; the hypothesized value of proportion under the null hypothesis.
	Default: 0.5.
plot.it	a logical; if TRUE, returns a plot; otherwise it doesn't.
	Default: TRUE.

Details

Suppose we are provided with a simple null hypothesis, and Type 1 & 2 error probabilities. Because of the discreteness issue in one-sample proportion tests in a fixed design, the fixed design alternative will not always decrease even if we are increasing the sample size. So, we first shortlist only those values from 1 to N which results in strictly decreasing UMPBT point alternatives (as is originally defined in Johnson (2013)). The effective maximum sample size is then chosen to be the maximum among those shorlisted value. So, obviously, the effective maximum sample size is either N or smaller than that.

Value

Returns a numeric, the effective maximum sample size.

Author(s)

Sandipan Pramanik, Valen E. Johnson and Anirban Bhattacharya

References

Main article and supplemental file of MSPRT

Johnson, Valen E., Uniformly most powerful Bayesian tests., Ann. of Stat., 41, (4), 2013, pp. 1716-1741

Examples

effective.N(N = 30, null = .2)

error.summary

Description

This function post processes the outputs of overshoot.oneProp(), overshoot.oneZ(), overshoot.oneT(), overshoot.twoZ() and overshoot.twoT(), and then calculates the Type 1 or Type 2 error probabilities of a MSPRT.

Usage

Arguments

	· cype	a character,
		"type1" for computing Type 1 error probability.
		"type2" for computing Type 2 error probability.
delta		a positive numeric; the termination threshold.
root		a numeric; given this, (error probability - root) is returned.
count		a numeric (integer);
		<pre>same as the "count" output from overshoot.oneProp(), overshoot.oneZ(), overshoot.oneT(), overshoot.twoZ() and overshoot.twoT() of the same error.type.</pre>
inconclusive.vec		
		a numeric vector;
		<pre>same as the "inconclusive.vec" output from overshoot.oneProp(), overshoot.oneZ(), overshoot.oneT(), overshoot.twoZ() and overshoot.twoT() of the same error.type.</pre>
R		a numeric (integer); number of replications in Monte Carlo method that is used in overshoot.oneProp(), overshoot.oneZ(), overshoot.oneT(), overshoot.twoZ() and overshoot.twoT() of the same error.type.
type1		a numeric in (0,1); the probability at which we want to control the Type 1 error of the MSPRT.
type2		a numeric in (0,1); the probability at which we want to control the Type 2 error of the MSPRT.

Details

Suppose we have the Monte Carlo outputs from overshoot.oneProp() or overshoot.oneZ() or overshoot.oneT() or overshoot.twoZ() or overshoot.twoT() corresponding to some error.type. Given these, the function returns the difference (error probability - root) for the MSPRT whose termination threshold is delta.

Value

a numeric; the difference (error probability of the MSPRT - root).

Author(s)

Sandipan Pramanik, Valen E. Johnson and Anirban Bhattacharya

find.alt	Finding the 'fixed design alternative'	
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Description

This function obtains the point alternative in one-sample binomial proportion tests, one & two-sample Z-tests, and one & two-sample T-tests in a fixed design.

Usage

test.type	a character; denotes the type of test;
	"oneProp" for a one-sample binomial proportion test.
	"oneZ" for a one-sample Z-test.
	"oneT" for a one-sample T-test.
	"twoZ" for a two-sample Z-test.
	"twoT" for a two-sample T-test.
side	a character; direction of the alternative hypothesis H1.
	Has to be one of "right" or "left".
	Default: "right".
null	a numeric; required only in one-sample proportion tests and one-sample Z-tests ; hypothesized value of the parameter under the null hypothesis.
	The hypothesized parameters are proportion in one-sample proportion tests, population mean in one-sample Z & T-tests, and difference between the population mean of Group-2 and Group-1 in two-sample Z & T-tests.
	In one-sample T-tests and two-sample Z & T-tests, only null=0 is allowed. This is done automatically. This argument is ignored in these cases.
	Default: 0.5 in one-sample proportion tests, and 0 in one-sample Z-tests.
n	a positive numeric (integer); required only in one-sample tests ; number of samples on which the fixed design one-sample test is based on.
n1	a positive numeric (integer); required only in two-sample tests ; number of samples from Group-1 on which the fixed design two-sample test is based on.

find.alt

n2	a positive numeric (integer); required only in two-sample tests ; number of samples from Group-2 on which the fixed design two-sample test is based on.
type1	a numeric in $(0, 1)$; Type 1 error probability of the test.
	Default: 0.005.
type2	a numeric in (0,1); Type 2 error probability.
	Corresponding to this, the point alternative is obtained.
	Default: 0.2.
sigma0	a positive numeric; required only in one & two-sample Z-tests.
	The known population standard deviation in one-sample Z-tests.
	The known common population standard deviation in two-sample Z-tests.
	Default: 1.

Details

At the 'fixed design alternative', the fixed design test of size type1 has Type 2 error type2.

In one-sample tests, the fixed design is based on n samples. In two-sample tests, the fixed design is based on n1 & n2 samples from Group 1 & 2, respectively.

Value

Returns a numeric which is the obtained 'fixed design alternative'.

Author(s)

Sandipan Pramanik, Valen E. Johnson and Anirban Bhattacharya

```
## finding the alternative in case of a one-sample proportion test
## which provides 80% power against a right and left sided
## alternative, respectively
# default null = 0.5
find.alt(test.type="oneProp", n= 60, type1= 0.005, type2= 0.2)
find.alt(test.type="oneProp", side= "left", n= 60,
        type1= 0.005, type2= 0.2)
# null = 0.2
find.alt(test.type="oneProp", null= 0.2, n= 60,
        type1= 0.005, type2= 0.2)
find.alt(test.type="oneProp", side= "left", null= 0.2,
        n= 60, type1= 0.005, type2= 0.2)
## finding the alternative in case of a one-sample Z-test
## which provides 80% power against a right and left sided
## alternative, respectively
```

find.alt

```
# default sigma0 = 1
# default null = 0
find.alt(test.type="oneZ", n= 60, type1= 0.005, type2= 0.2)
find.alt(test.type="oneZ", side= "left", n= 60, type1= 0.005,
         type2= 0.2)
# null = 3
find.alt(test.type="oneZ", null= 3, n= 60, type1= 0.005, type2= 0.2)
find.alt(test.type="oneZ", side= "left", null= 3, n= 60,
         type1= 0.005, type2= 0.2)
## finding the alternative in case of a one-sample T-test
## which provides 80% power against a right and left sided
## alternative, respectively
# default null = 0
find.alt(test.type="oneT", n= 60, type1= 0.005, type2= 0.2)
find.alt(test.type="oneT", side= "left", n= 60,
        type1= 0.005, type2= 0.2)
\# null = 3
find.alt(test.type="oneT", null= 3, n= 60, type1= 0.005,
         type2= 0.2)
find.alt(test.type="oneT", side= "left", null= 3,
        n= 60, type1= 0.005, type2= 0.2)
## finding the alternative in case of a two-sample Z-test
## which provides 80% power against a right and left sided
## alternative, respectively
# default sigma0 = 1
find.alt(test.type="twoZ", n1= 60, n2= 50, type1= 0.005, type2= 0.2)
find.alt(test.type="twoZ", side= "left", n1= 60, n2= 50, type1= 0.005,
         type2= 0.2)
## finding the alternative in case of a two-sample T-test
## which provides 80% power against a right and left sided
## alternative, respectively
find.alt(test.type="twoT", n1= 60, n2= 50, type1= 0.005, type2= 0.2)
find.alt(test.type="twoT", side= "left", n1= 60, n2= 50, type1= 0.005,
         type2= 0.2)
```

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find.samplesize

Sample size required to achieve a higher significance for one-sample tests in a fixed design

Description

This function finds the sample size that is required to maintain a desired power at a point alternative when we decrease the level of significance of a fixed design one-sample test. This can be calculated in one-sample proportion tests, and one-sample Z & T-tests.

Usage

test.type	a character; denotes the type of test;
	"oneProp" for a one-sample proportion tests.
	"oneZ" for a one-sample Z-tests.
	"oneT" for a one-sample T-tests.
Ν	a positive numeric (integer); required only in one-sample tests ; number of samples on which the fixed design one-sample test is based on.
lower.signif	a numeric in (0,1); denotes the lower level of significance.
	Default: 0.05.
higher.signif	a numeric in (0,1); denotes the higher level of significance.
	Default: 0.005.
null	a numeric; denotes the hypothesized value of the parameter under the null hypothesis.
	The hypothesized parameters are proportion in one-sample proportion tests, and population mean in one-sample Z & T-tests.
	Default: 0.5 in one-sample proportion tests, and 0 in one-sample Z and T-tests.
side	a character; direction of the alternative hypothesis H1.
	Has to be one of "right" or "left".
	Default: "right".
ром	a numeric in (0,1); desired level of power at the point alternative alt.
	Default: 0.8. This means 80 percent power.
alt	missing or a numeric; value of the point alternative where we want to maintain the power pow.
	Default: the 'fixed design alternative' at the lower.signif using N samples.

sigma0	a positive numeric; required only in one-sample Z-tests. known population standard deviation.
	Default: 1.
n.seq	missing or a numeric vector; the final value of increased sample size is searched over this vector.
	Default: N:(4*N).
verbose	logical; if TRUE, returns a message of the achieved results; otherwise it doesn't. Default: TRUE.
plot.it	a logical; if TRUE, returns a plot; otherwise it doesn't. Default: TRUE.

Value

Returns a numeric. In a fixed design for the specified one-sample test, this is the sample size that we require to achieve higher.signif while still mainting at least pow amount of power at alt.

Author(s)

Sandipan Pramanik, Valen E. Johnson and Anirban Bhattacharya

References

Main article and supplemental file of MSPRT

Examples

find.samplesize(test.type = "oneProp", N = 30, null = .2)

```
# In this case, the fixed design alternative at 0.05 is 0.4263. As it seems,
# we need to increase the sample size to 51 to achieve the higher significance
# of 0.005 while still maintaining at least 80% power at 0.4263.
```

```
find.samplesize(test.type = "oneProp", N = 30, null = .2, side = "left")
```

```
# In this case, the fixed design alternative at 0.05 is 0.0516. For testing
# against the left sided alternative, we need to increase the sample size to
# 66 to achieve the higher significance of 0.005 while still maintaining at
# least 80% power at 0.0516.
```

```
find.samplesize(test.type = "oneZ", N = 30)
find.samplesize(test.type = "oneZ", N = 30, side = "left")
```

```
find.samplesize(test.type = "oneT", N = 30)
find.samplesize(test.type = "oneT", N = 30, side = "left")
```

find.threshold.oneProp

Optimizing the UMPBT objective function in fixed design one-sample proportion tests

Description

Given δ , this function finds the difference (optimum value of the objective function –a constant) in one-sample proportion tests in a fixed design. Notation is as in the supplemental information.

Usage

```
find.threshold.oneProp(delta, side = "right", n, p0 = 0.5, opt.interval, root)
```

Arguments

delta	a positive numeric; corresponding to this, the UMPBT alternative (UMPBT(δ)) is obtained.
side	a character; direction of the alternative hypothesis H1.
	Has to be one of "right" or "left".
	Default: "right".
n	a positive numeric (integer); number of samples on which the fixed design one- sample test is based on.
p0	a numeric in (0,1); the hypothesized value of proportion under the simple null hypothesis.
	Default: 0.5.
opt.interval	a numeric vector of length 2; contains the lower and upper endpoints of an in- terval to be optimized over.
	Endpoints should lie inside (0,1).
	Default: c(p0,1) if side = "right", and c(0,p0) if side = "left".
root	a numeric; the 'constant' in the above description.
	Given this, the function returns (optimum value of the objective function -root).

Details

Apart from finding the optimum value of the objective function, the argument root can be used to solve for a delta. For example, using root=k we can find a delta such that the optimized value of the objective function is k.

Value

If root=k, this returns a numeric denoting the difference (optimum value of the objective function -k).

Author(s)

Sandipan Pramanik, Valen E. Johnson and Anirban Bhattacharya

Examples

returns minimum value of the objective function
find.threshold.oneProp(delta= 25, n= 60, p0= 0.2, root= 0)

returns (minimum value of the objective function -5)
find.threshold.oneProp(delta= 25, n= 60, p0= 0.2, root= 5)

implement.MSPRT Implementing a MSPRT

Description

Once we have designed the MSPRT (that is, obtained the termination threshold, γ) using design.MSPRT(), this function implements the MSPRT algorithm for a given data. This is done by sequentially calculating the likelihood ratio(s) or bayes factor(s) (L_n), and then comparing them with the acceptance and rejection thresholds.

This function implements the MSPRT in one-sample proportion tests, and one & two-sample Z & T-tests.

Usage

test.type	a character; denotes the type of test.
	"oneProp" for a one-sample binomial proportion test.
	"oneZ" for a one-sample Z-test.
	"oneT" for a one-sample T-test.
	"twoZ" for a two-sample Z-test.
	"twoT" for a two-sample T-test.
obs	a numeric vector; required only in one-sample tests.
	Denotes the sequentially observed data based on which we want to carry out the null hypothesis significance testing (NHST) using a one-sample test.
obs1	a numeric vector; required only in two-sample tests.
	Denotes the sequentially observed data from Group-1 based on which we want to carry out the NHST using a two-sample test.

obs2	a numeric vector; required only in two-sample tests.
	Denotes the sequentially observed data from Group-2 based on which we want to carry out the NHST using a two-sample test.
side	a character; direction of the alternative hypothesis H1.
	Has to be one of "right" or "left".
	Default: "right".
batch.seq	a numeric vector; required only in one-sample tests. Sizes of sequentially observed batches in a group sequential design.
	Required only if the design is group sequential, that is when data are observed in batches. Otherwise, only need to provide N.max.
batch1.seq	a numeric vector; required only in two-sample tests. Sizes of sequentially observed batches from Group-1 in a group sequential design.
	Required only if the design is group sequential, that is when data from Group-1 are observed in batches. Otherwise, only need to provide N1.max.
batch2.seq	a numeric vector; required only in two-sample tests. Sizes of sequentially observed batches from Group-2 in a group sequential design.
	Required only if the design is group sequential, that is when data from Group-2 are observed in batches. Otherwise, only need to provide N2.max.
type1	a numeric in (0,1); the probability at which we want to control the Type 1 error of the MSPRT.
	Default: 0.005.
type2	a numeric in (0,1); the probability at which we want to control the Type 2 error of the MSPRT.
	Default: 0.2.
null	a numeric; required only in one-sample tests. the hypothesized value of parameter under the null hypothesis.
	The hypothesized parameters are proportion in one-sample proportion tests, population mean in one & two-sample Z & T-tests, and difference between the population mean of Group-2 and Group-1 in two-sample Z & T-tests.
	In two-sample tests, only null=0 is allowed. This is done automatically. This argument is ignored in these cases.
	Default: 0.5 in one-sample binomial proportion test, and 0 in one-sample Z and T-tests.
sigma0	a positive numeric; required only in one & two-sample Z-tests. Known pop- ulation standard deviation in one-sample tests and known common population standard deviation in two-sample tests.
	Default: 1.
term.thresh	a positive numeric; denotes the termination threshold of a MSPRT.
	This is determined at the designing step of a MSPRT using design.MSPRT().
N.max	a positive numeric (integer); required only in one-sample tests. Maximum number of samples that we can afford in the one-sample test.
	In a group sequential design, this should be equal to sum(batch.seq). So in that case, it's enough to provide only batch.seq and not N.max.

N1.max	a positive numeric (integer); required only in two-sample tests. Maximum number of samples from Group-1 that we can afford in the two-sample test.
	In a group sequential design, this should be equal to sum(batch1.seq). So in that case, it's enough to provide only batch1.seq and not N1.max.
N2.max	a positive numeric (integer); required only in two-sample tests. Maximum number of samples from Group-2 that we can afford in the two-sample test.
	In a group sequential design, this should be equal to sum(batch2.seq). So in that case, it's enough to provide only batch2.seq and not N2.max.
plot.it	logical vector; if TRUE (Default), a comparison plot is returned. Otherwise it's not.
verbose	a logical; if TRUE, returns messages of the current proceedings; otherwise it doesn't.
	Default: TRUE.

Details

Suppose we want to carry out one of the above tests. To do that, we simply need to follow two steps:

Step 1: Designing the MSPRT: Determine the 'Termination threshold' using design.MSPRT().

Step 2: Implementing the MSPRT: Implement the MSPRT algorithm for a sequentially observed data using implement.MSPRT(). In Step 2, we need to use the termination threshold obtained from Step 1.

Value

Returns a list with the following components:

decision	a character; the decision reached based on the provided data.
	Either "reject" (means 'Reject H0') or "accept" (means 'Don't reject H0') or "continue" (means 'continue sampling').
n	a numeric (integer); number of samples required for reaching the decision.
lhood.ratio	a numeric vector; a vector of likelihood ratios $(L_n$'s) in favor of the UMPBT alternative.
	This is computed at each element of batch.seq until the available data or the maximum available sample size.
rej.threshold	a numeric; Wald's rejection threshold.
acc.threshold	a numeric; Wald's acceptance threshold.
umpbt.alt	a numeric or numeric vector; denotes the UMPBT alternative(s).
	At each stage, likelihood ratios $(L_n$'s) are computed in favor of this alternative.
psi.umpbt	a numeric; denotes the mixing probability for the UMPBT alternative in one- sample proportion tests.
	Returned only in one-sample proportion tests.

Author(s)

Sandipan Pramanik, Valen E. Johnson and Anirban Bhattacharya

References

MSPRT: Main article and Supplemental file

Johnson, Valen E., Uniformly most powerful Bayesian tests., Ann. of Stat., 41, (4), 2013, pp. 1716-1741

Johnson, Valen E., Revised standards for statistical evidence., Proceedings of the National Academy of Sciences, 16, 1945.

Daniel J. Benjamin, James O. Berger, Magnus Johannesson, et al. Redefine statistical significance. Nature Human Behaviour, 2017.

Examples

the termination thresholds are obtained from design.MSPRT()

one-sample tests

proportion test

Z-test

```
x = c(4.060319, 5.275465, 3.746557, 7.392921, 5.494262,
3.769297, 5.731144, 6.107487, 5.863672)
```

T-test

x = c(1.738717, 5.076539, 1.116762, 3.105214, 5.567161, 2.095638, 2.291750, 2.046943, 2.571340, 3.207162, 4.841446, 1.797331)

two-sample tests

Z-test

x1 = c(0.6546282, 2.2772738, 4.3817680, 0.3044365, 1.8796224, 2.1986304, 3.0619321, 1.6404530, 4.9767109) # group-1

```
x^2 = c(0.5570999, 1.5612114, 2.3881823, 0.2718022, 2.2936742,
      2.0451859, 2.1281266, 3.6749153, 0.1717139) # group-2
implement.MSPRT(test.type = "twoZ", obs1 = x1, obs2 = x2,
               sigma0 = 1.5, term.thresh = 27.928,
               N1.max = 30, N2.max = 30)
### T-test
x1 = c(-0.93968072, 0.27546499, -1.25344292, 2.39292120, 0.49426166,
       -1.23070258, 0.73114358, 1.10748706, 0.86367203, -0.45808258,
       2.26767175, 0.58476485, -0.93186087, -3.32204983, 1.68739638,
       -0.06740041, -0.02428539, 1.41575432, 1.23183179) # group-1
x2 = c( 0.6546282, 2.2772738, 4.3817680, 0.3044365, 1.8796224,
       2.1986304, 3.0619321, 1.6404530, 4.9767109, 1.7918195,
       2.6264761, 3.4726292, 1.4109570, 0.4404965, 4.6733434,
      -1.4666036, 3.3179069, 2.0537101, 3.5192430) # group-2
implement.MSPRT(test.type = "twoT", obs1 = x1, obs2 = x2,
               term.thresh = 32.972, N1.max = 30, N2.max = 30)
```

Description

Given a simple null and a simple alternative hypotheses, this function calculates the likelihood ratio (LR) in favor of the alternative based on an observed data in one-sample proportion tests.

Usage

LR.oneProp(m, suff.stat, null = 0.5, alt)

m	a postive numeric (integer); number of samples for computing the LR.
suff.stat	a postive numeric (integer); the value of sufficient statistic based on m observed data.
	In this case, the sufficient statistic is the total no. of successes out of m observations.
null	a numeric in (0,1); the hypothesized value of proportion under the simple null. Default: 0.5.
alt	a numeric in $(0,1)$; the hypothesized value of proportion under the simple alternative.

LR.oneT

Value

Returns a numeric denoting the LR in favor of alt in the one-sample proportion test based on m observations.

Author(s)

Sandipan Pramanik, Valen E. Johnson and Anirban Bhattacharya

References

MSPRT: supplemental information

Examples

LR.oneProp(m= 60, suff.stat= 48, null= 0.2, alt= 0.5)

```
LR.oneT
```

Bayes factor in one-sample T-tests

Description

Given a simple null and a simple alternative hypotheses, this function calculates the bayes factor (BF) in favor of the alternative based on an observed data in one-sample T-tests.

Usage

LR.oneT(m, suff.stat, null = 0, alt, s)

Arguments

m	a postive numeric (integer); number of samples for computing the BF.
suff.stat	numeric; the value of sufficient statistic based on m observed data.
	In this case, the sufficient statistic is the sum of m observations.
null	a numeric; the hypothesized value of population mean under the simple null. Default: 0.
alt	a numeric; the hypothesized value of population mean under the simple alterna tive.
S	a positive numeric; sample standard deviation (with divisor (m-1)) of the m ob servations.

Value

Returns a numeric denoting the BF in favor of alt in one-sample T-tests based on m observations.

Author(s)

Sandipan Pramanik, Valen E. Johnson and Anirban Bhattacharya

References

MSPRT: supplemental information

Examples

LR.oneT(m= 60, suff.stat= 20.2, alt= 1.5, s= 1.2)

LR.oneZ

Likelihood ratio in one-sample Z-tests

Description

Given a simple null and a simple alternative hypotheses, this function calculates the likelihood ratio (LR) in favor of the alternative based on an observed data in one-sample Z-tests.

Usage

LR.oneZ(m, suff.stat, null = 0, alt, sigma0 = 1)

Arguments

m	a postive numeric (integer); number of samples for computing the LR.
suff.stat	numeric; the value of sufficient statistic based on m observed data.
	In this case, the sufficient statistic is the sum of m observations
null	a numeric; the hypothesized value of population mean under the simple null.
	Default: 0.
alt	a numeric; the hypothesized value of population mean under the simple alternative.
sigma0	a positive numeric; the known population standard deviation (sd). Default: 1.

Value

Returns a numeric denoting the LR in favor of alt in the one-sample Z-test based on m observations.

Author(s)

Sandipan Pramanik, Valen E. Johnson and Anirban Bhattacharya

References

MSPRT: supplemental information

Examples

LR.oneZ(m= 60, suff.stat= 10.5, alt= 0.5)

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LR.twoT

Description

Given the simple null equals to 0 and a simple alternative hypothesis, this function calculates the bayes factor (BF) in favor of the alternative based on an observed data in two-sample T-tests.

Usage

LR.twoT(m1, m2, suff.stat1, suff.stat2, alt, s)

Arguments

m1	a postive numeric (integer); number of samples from Group-1 for computing the BF.
m2	a postive numeric (integer); number of samples from Group-2 for computing the BF.
suff.stat1	numeric; the value of sufficient statistic based on m1 samples from Group-1. In this case, the sufficient statistic is the mean of these m1 observations.
suff.stat2	numeric; the value of sufficient statistic based on m2 samples from Group-2. In this case, the sufficient statistic is the mean of these m2 observations.
alt	a numeric; the hypothesized value under the simple alternative.
S	a positive numeric; pooled sample standard deviation using m1 observations from Group-1 and m2 observations from Group-2.

Value

Returns a numeric denoting the BF in favor of alt in the two-sample T-test based on the observations.

Author(s)

Sandipan Pramanik, Valen E. Johnson and Anirban Bhattacharya

References

MSPRT: supplemental information

```
LR.twoT(m1= 60, m2= 50, suff.stat1= 20, suff.stat2= 19, alt= 1, s= 1)
```

LR.twoZ

Description

Given the simple null equals to 0 and a simple alternative hypotheses, this function calculates the likelihood ratio (LR) in favor of the alternative based on an observed data in two-sample Z-tests.

Usage

```
LR.twoZ(m1, m2, suff.stat1, suff.stat2, alt, sigma0 = 1)
```

Arguments

m1	a postive numeric (integer); number of samples from Group-1 for computing the LR.
m2	a postive numeric (integer); number of samples from Group-2 for computing the LR.
suff.stat1	numeric; the value of sufficient statistic based on m1 samples from Group-1. In this case, the sufficient statistic is the mean of those m1 observations.
suff.stat2	numeric; the value of sufficient statistic based on m2 samples from Group-2. In this case, the sufficient statistic is the mean of those m2 observations.
alt	a numeric; hypothesized value under the simple alternative
sigma0	a positive numeric; the known common population standard deviation (sd) Default is 1.

Value

Returns a numeric denoting the LR in favor of alt in the two-sample Z-test based on the observations.

Author(s)

Sandipan Pramanik, Valen E. Johnson and Anirban Bhattacharya

References

MSPRT: supplemental information

```
LR.twoZ(m1= 60, m2= 50, suff.stat1= 20, suff.stat2= 19, alt= 1, sigma0= 1.2)
```

Description

This is the $h(p, \delta)$ function as in the supplemental file. Given a δ , we optimize this function to get the UMPBT(δ) alternative for one-sample proportion tests in a fixed design.

Usage

objfunc.oneProp(p, delta, n, p0)

Arguments

р	a numeric in (0,1); the value of proportion.
delta	a positive numeric; corresponding to this δ , the UMPBT(δ) alternative is obtained.
n	a positive numeric (integer); number of samples to be used.
p0	a numeric in $(0, 1)$; the hypothesized value of proportion under the simple null.

Value

Returns a numeric which is the value of the objective function.

Author(s)

Sandipan Pramanik, Valen E. Johnson and Anirban Bhattacharya

References

MSPRT: Supplemental information

Johnson, Valen E., Uniformly most powerful Bayesian tests., Ann. of Stat., 41, (4), 2013, pp. 1716-1741

```
objfunc.oneProp(p= .5, delta= 25, n= 60, p0= 0.2)
```

OC.MSPRT

Description

This function evaluates the operating characteristics (OC) for a MSPRT at any specified value of the hypothesized parameter. If the specified value lies in the region of the alternative hypothesis, this computes the Type 2 error probability of the MSPRT; otherwise this computes the Type 1 error probability. In both cases, this also computes the number of samples those are required on an average for making a decision.

Usage

test.type	a character; denotes the type of test.
	"oneProp" for a one-sample binomial proportion test.
	"oneZ" for a one-sample Z-test.
	"oneT" for a one-sample T-test.
	"twoZ" for a two-sample Z-test.
	"twoT" for a two-sample T-test.
side	a character; direction of the alternative hypothesis H1.
	Has to be one of "right" or "left".
	Default: "right".
batch.seq	a numeric vector; required only in one-sample tests. Sizes of sequentially observed batches in a group sequential design.
	Required only if the design is group sequential, that is when data are observed in batches. Otherwise, only need to provide N.max.
batch1.seq	a numeric vector; required only in two-sample tests. Sizes of sequentially observed batches from Group-1 in a group sequential design.
	Required only if the design is group sequential, that is when data from Group-1 are observed in batches. Otherwise, only need to provide N1.max.
batch2.seq	a numeric vector; required only in two-sample tests. Sizes of sequentially observed batches from Group-2 in a group sequential design.
	Required only if the design is group sequential, that is when data from Group-2 are observed in batches. Otherwise, only need to provide N2.max.
null	a numeric; required only in one-sample tests. Denotes value of the hypothe- sized parameter under the null hypothesis.

	The hypothesized parameters are proportion in one-sample binomial proportion test, population mean in one-sample Z & T-tests, and difference between the population means of Group-2 and Group-1 in two-sample Z & T-tests.
	In two-sample tests, only null=0 is allowed. This is done automatically. This argument is ignored in these cases.
	Default: 0.5 in one-sample binomial proportion test, and 0 in one-sample Z-tests.
term.thresh	a positive numeric; denotes the termination threshold of a MSPRT. This is determined at the designing step of a MSPRT using design.MSPRT().
theta	a numeric; the value of hypothesized parameter where we want to evaluate the OC for the MSPRT.
sigma0	a positive numeric; required only in one & two-sample Z-tests. Known population standard deviation in one-sample tests and known common population standard deviation in two-sample tests. Default: 1.
type1	a numeric in $(0, 1)$; the probability at which we want to control the Type 1 error of the MSPRT.
	Default: 0.005.
type2	a numeric in (0,1); the probability at which we want to control the Type 2 error of the MSPRT.
	Default: 0.2.
N.max	a positive numeric (integer); required only in one-sample tests. Maximum number of samples that we can afford in the one-sample test.
	In a group sequential design, this should be equal to sum(batch.seq). So in that case, it's enough to provide only batch.seq and not N.max.
N1.max	a positive numeric (integer); required only in two-sample tests. Maximum number of samples from Group-1 that we can afford in the two-sample test. In a group sequential design, this should be equal to sum(batch1.seq). So in that case, it's enough to provide only batch1.seq and not N1.max.
N2.max	a positive numeric (integer); required only in two-sample tests. Maximum number of samples from Group-2 that we can afford in the two-sample test. In a group sequential design, this should be equal to sum(batch2.seq). So in that case, it's enough to provide only batch2.seq and not N2.max.
verbose	a logical; if TRUE, returns messages of the current proceedings; otherwise it doesn't.
repl	a positve numeric (integer); total number of replications to be used in Monte Carlo method to calculate the OC of the MSPRT. Default (Recommended): 2e+6 in a one-sample proportion test; 1e+6 other-
	wise. Should be at least 1e+5.
core.no	a numeric; number of cores this function can use for carrying out a parallel computation.
	Default: 1 if there are at most 2 cores, otherwise (number of cores -1).

Details

For side="right", if theta>null then the Type 2 error is calculated, where as the Type 1 error is calculated when theta<=null; and vice versa.

To put it simply, if theta falls under the alternative hypothesis, then Type 2 error and avg.n1 (in one-sample tests) or $avg.n1_1$ & $avg.n2_1$ (in two-sample tests) are calculated; otherwise Type 1 error and avg.n0 (in one-sample tests) or $avg.n1_0$ & $avg.n2_0$ (in two-sample tests) are calculated.

Value

Returns a list with the following components:

In one-sample tests:

type1.est or type2.est

a numeric in (0,1); the Type 1 or Type 2 error probability of the MSPRT evaluated at theta, respectively.

avg.n0 or avg.n1

a positive numeric; the number of samples required on an average by the MSPRT for reaching a decision when theta is actually true.

n0.vec or n1.vec

a numeric vector; denotes a vector of sample sizes required for reaching a decision in each of the repl replications in the Monte-Carlo study when theta is actually true.

This is a vector of length repl.

In two-sample tests:

type1.est or type	2.est
a u	a numeric in (0,1); the Type 1 or Type 2 error probability of the MSPRT evaluated at theta, respectively.
avg.n1_0&avg.n2	_0, or avg.n1_1 & avg.n2_1
a f	a positive numeric; the number of samples required on an average by the MSPRT from Group 1 and 2 for reaching a decision when theta is actually true.
n1_0.vec&n2_0.vec, or n1_1.vec&n2_1.vec	
a 2 s	a numeric vector; denotes a vector of sample sizes required from Group 1 and 2 for reaching a decision in each of the repl replications in the Monte-Carlo study when theta is actually true.
]	This is a vector of length rep1.

Author(s)

Sandipan Pramanik, Valen E. Johnson and Anirban Bhattacharya

Examples

the termination thresholds are obtained from design.MSPRT()

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```
## One-sample proportion test
## finding OC at theta = 0.3
# OC.MSPRT(test.type = "oneProp", null = 0.2,
          term.thresh = 22.63, theta = 0.3, N.max = 30)
#
## One-sample Z-test
## finding OC at theta = 4
# OC.MSPRT(test.type = "oneZ", null = 3, sigma0 = 1.5,
#
           term.thresh = 27.856, theta = 4, N.max = 30)
## One-sample T-test
## finding OC at theta = 4
# OC.MSPRT(test.type = "oneT", null = 3,
#
           term.thresh = 33.152, theta = 4, N.max = 30)
## Two-sample Z-test
## finding OC at theta = 1
# OC.MSPRT(test.type = "twoZ", sigma0 = 1.5, term.thresh = 27.928,
           theta = 1, N1.max = 30, N2.max = 30)
#
## Two-sample T-test
## finding OC at theta = 1
# OC.MSPRT(test.type = "twoT", term.thresh = 32.972,
#
           theta = 1, N1.max = 30, N2.max = 30)
```

overshoot.oneProp	Error summary of the truncated Wald's SPRT in one-sample propor-
	tion tests

Description

MSPRT is designed on the assumption that we can afford at most, say, N samples. This function calculates a summary of the Type 1 or Type 2 error committed by the Wald's SPRT when it is simply truncated at N in one-sample proportion tests. This is done using parallel computation.

It is worth a mention that a case may remain inconclusive due to the truncation. The required sample size for reaching that decision is N.

Usage

Arguments

error.type	a character; specifies which of the 2 types of errors need to be accounted for. "type1" for Type 1 error.
	"type2" for Type 2 error.
batch.seq	a numeric vector; an increasing sequence of values until N. Denotes the sequence of sample sizes where a user will observe data sequentially.
	Last element should equal to N.
null	a numeric in $(0,1)$; the hypothesized value of proportion under the simple null hypothesis.
gen.par	a numeric; the value of proportion from which the data needs to be generated from.
alt.LR	a numeric vector of lenth 2; this consists of the 2 UMPBT alternative points. The sequence of weighted likelihood ratios (L_n) is computed in favour of this alternative.
	This is same with the output u from umpbt.oneProp().
alt.psi	a numeric in (0,1); the mixing probability corresponding to the first component of alt.LR in the UMPBT alternative.
	This is same with the output psi from umpbt.oneProp().
up	a numeric; value of a constant rejection threshold. Should be greater than low.
low	a numeric; value of a constant acceptance threshold. Should be smaller than up.
Ν	a positive numeric (integer); number of samples where truncation of Wald's SPRT is required.
	In a MSPRT, this is the maximum available sample size.
R	a positive numeric (integer); number of replications desired in the Monte Carlo study.
	At least 1e+5 is required.
core.no	a numeric; number of cores this function can use for carrying out the Monte Carlo study using the parallel computing.
return.n	logical; if TRUE, this returns a vector of sample sizes required for reaching a decision in each of the R replications.

Value

If return.n = TRUE, a list with following components is returned:

count	a numeric; number of errors of error. type those are committed out of R repli-
	cations.
inconclusive.ve	ec

a numeric vector; a vector containing the likelihood ratio values at N which remained inconclusive at the last stage.

overshoot.oneT

n.vec a numeric vector; a vector of the required number of samples in each replications. This vector has length R.

If return.n = FALSE, the same list except n.vec is returned.

Author(s)

Sandipan Pramanik, Valen E. Johnson and Anirban Bhattacharya

References

Wald, A., Sequential Tests of Statistical Hypotheses. Ann. of Math. Statist., vol. 16, no. 2, 1945, 117-186.

Examples

overshoot.oneT

Error summary of the truncated Wald's SPRT in one-sample T-tests

Description

MSPRT is designed on the assumption that we can afford at most, say, N samples. This function calculates a summary of the Type 1 or Type 2 error committed by the Wald's SPRT when it is simply truncated at N in one-sample T-tests. This is done using parallel computation.

It is worth a mention that a case may remain inconclusive due to the truncation. The required sample size for reaching that decision is N.

Usage

Arguments

side	a character; direction of the alternative hypothesis H1. Has to be one of "right" or "left".
error.type	a character; specifies which of the 2 types of errors need to be accounted for. "type1" for Type 1 error. "type2" for Type 2 error.
batch.seq	a numeric vector; an increasing sequence of values until N. Denotes the sequence of sample sizes where a user will observe data sequentially. First element should be at least 2. Last element should equal to N.
type1	a numeric in $(0, 1)$; the probability at which we want to control the Type 1 error of the MSPRT.
null	a numeric; the hypothesized value of population mean under the simple null hypothesis.
gen.par	a numeric; the value of population mean from which normal observations need to be generated from.
up	a numeric; value of a constant rejection threshold. Should be greater than low.
low	a numeric; value of a constant acceptance threshold. Should be smaller than up.
Ν	a positive numeric (integer); number of samples where truncation of Wald's SPRT is required.
	In a MSPRT, this is the maximum available sample size.
R	a positive numeric (integer); number of replications desired in the Monte Carlo study.
	At least 1e+5 is required.
core.no	a numeric; number of cores this function can use for carrying out the Monte Carlo study using the parallel computing.
return.n	logical; if TRUE, this returns a vector of sample sizes required for reaching a decision in each of the R replications.

Value

If return.n = TRUE, a list with following components is returned:

count	a numeric; number of errors of error.type those are committed out of R replications.
inconclusive.ve	c
	a numeric vector; a vector containing the likelihood ratio values at N which remained inconclusive at the last stage.
n.vec	a numeric vector; a vector of the required number of samples in each replications. This vector has length ${\sf R}.$

If return.n = FALSE, the same list except n.vec is returned.

Author(s)

Sandipan Pramanik, Valen E. Johnson and Anirban Bhattacharya

overshoot.oneZ

References

Wald, A., Sequential Tests of Statistical Hypotheses. Ann. of Math. Statist., vol. 16, no. 2, 1945, 117-186.

Examples

```
N.max = 30
#overshoot.oneT( side="right", error.type= "type1", batch.seq= 2:N.max, null= 0,
# type1 = 0.005, gen.par= 0, up= 160, low= 0.2, N= N.max, R= 1e+6, core.no= 2,
# return.n = T)
#overshoot.oneT( side="right", error.type= "type2", batch.seq= 2:N.max, null= 0,
# type1 = 0.005, gen.par= 1.5, up= 160, low= 0.2, N= N.max, R= 1e+6, core.no= 2,
# return.n = T)
```

overshoot.oneZ

Error summary of the truncated Wald's SPRT in one-sample Z-tests

Description

MSPRT is designed on the assumption that we can afford at most, say, N samples. This function calculates a summary of the Type 1 or Type 2 error committed by the Wald's SPRT when it is simply truncated at N in one-sample Z-tests. This is done using parallel computation.

It is worth a mention that a case may remain inconclusive due to the truncation. The required sample size for reaching that decision is N.

Usage

error.type	a character; specifies which of the 2 types of errors need to be accounted for.
	"type1" for Type 1 error.
	"type2" for Type 2 error.
batch.seq	a numeric vector; an increasing sequence of values until N. Denotes the sequence of sample sizes where a user will observe data sequentially. Last element should equal to N.
null	a numeric; the hypothesized value of population mean under the simple null hypothesis.
gen.par	a numeric vector of length 2; the first component is the value of the population mean and second component is the known standard deviation (sd).
	Observations are generated from a normal distribution with this mean and sd.

calculated sequentially.
The UMPBT point alternative is used in case of a MSPRT. This is same with the output u from umpbt.oneZ().
a numeric; value of a constant rejection threshold; should be greater than low.
a numeric; value of a constant acceptance threshold; should be smaller than up.
a positive numeric (integer); number of samples where truncation of Wald's SPRT is required;
in a MSPRT, this is the maximum available sample size.
a positive numeric (integer); number of replications desired in the Monte Carlo study; at least 1e+5 is required
a numeric;
number of cores this function can use for carrying out the Monte Carlo study using the parallel computing.
logical; if TRUE, this returns a vector of sample sizes required for reaching a decision in each of the R replications.

Value

If return.n = TRUE, a list with following components is returned:

count	a numeric; number of errors of error . type those are committed out of ${\sf R}$ repli-		
	cations		
inconclusive.ve	inconclusive.vec		
	a numeric vector; a vector containing the values of ${\cal L}_N$ which remained inconclusive at the last stage		
n.vec	a numeric vector; a vector of the required number of samples; this is of length ${\sf R}.$		
If return.n = FALSE, the same list except n.vec is returned.			

Author(s)

Sandipan Pramanik, Valen E. Johnson and Anirban Bhattacharya

References

Wald, A., Sequential Tests of Statistical Hypotheses. Ann. of Math. Statist., vol. 16, no. 2, 1945, 117-186.

```
N.max = 30
#overshoot.oneZ( error.type= "type1", batch.seq= 1:N.max, null= 0,
# gen.par= c(0,1), alt.LR= 1, up= 160, low= 0.2, N= N.max,
# R= 1e+6, core.no= 2, return.n = T)
```

```
#overshoot.oneZ( error.type= "type2", batch.seq= 1:N.max, null= 0,
# gen.par= c(1.5,1), alt.LR= 1, up= 160, low= 0.2, N= N.max,
# R= 1e+6, core.no= 2, return.n = T)
```

overshoot.twoT Error summary of the truncated Wald's SPRT in two-sample T-tests

Description

MSPRT is designed on the assumption that we can afford at most, say, N samples. This function calculates a summary of the Type 1 or Type 2 error committed by the Wald's SPRT when it is simply truncated at N in two-sample T-tests. This is done using parallel computation.

It is worth a mention that a case may remain inconclusive due to the truncation. The required sample size for reaching that decision is N.

Usage

side	a character; direction of the alternative hypothesis H1.
	Has to be one of "right" or "left".
error.type	a character; specifies which of the 2 types of errors need to be accounted for.
	"type1" for Type 1 error.
	"type2" for Type 2 error.
batch1.seq	a numeric vector; an increasing sequence of values until N1. Denotes the sequence of sample sizes where data is observed sequentially from Group-1.
	First element should be at least 2. Last element should equal be to N1.
batch2.seq	a numeric vector; an increasing sequence of values until N2. Denotes the se- quence of sample sizes where data is observed sequentially from Group-2.
	First element should be at least 2. Last element should equal be to N2.
type1	a numeric in $(0, 1)$; the probability at which we want to control the Type 1 error of the MSPRT.
gen.par	a numeric; observations from Group-1 and 2 are generated from the normal distributions with common variance 1, and means -gen.par and gen.par, respectively.
up	a numeric; value of a constant rejection threshold. Should be greater than low.
low	a numeric; value of a constant acceptance threshold. Should be smaller than up.
N1	a positive numeric (integer); maximum available number of samples from Group-1.

N2	a positive numeric (integer); maximum available number of samples from Group-2.
R	a positive numeric (integer); number of replications desired in the Monte Carlo study. At least 1e+5 is required.
core.no	a numeric; number of cores this function can use for carrying out the Monte Carlo study using the parallel computing.
return.n	logical; if TRUE, this returns a vector of sample sizes required for reaching a decision in each of the R replications.

Value

If return.n = TRUE, a list with following components is returned:

count	a numeric; number of errors of error.type those are committed out of R replications.
inconclusive.ve	ec
	a numeric vector; a vector containing the likelihood ratio values at N which remained inconclusive at the last stage.
n.vec	a numeric vector; a vector of the required number of samples in each replications. This vector has length $R.$

If return.n = FALSE, the same list except n.vec is returned.

Author(s)

Sandipan Pramanik, Valen E. Johnson and Anirban Bhattacharya

References

Wald, A., Sequential Tests of Statistical Hypotheses. Ann. of Math. Statist., vol. 16, no. 2, 1945, 117-186.

```
N1.max = 30
N2.max = 30
#overshoot.twoT( side="right", error.type= "type1",
                 batch1.seq= 2:N1.max, batch2.seq= 2:N2.max,
#
                 type1= 0.005, gen.par= 0, up= 160, low= 0.2,
#
                 N1= N1.max, N2= N2.max, R= 1e+6, core.no= 2, return.n = T)
#
#overshoot.twoT( side="right", error.type= "type2",
#
                 batch1.seq= 2:N1.max, batch2.seq= 2:N2.max,
#
                 type1= 0.005, gen.par= 1, up= 160, low= 0.2,
#
                 N1= N1.max, N2= N2.max, R= 1e+6, core.no= 2, return.n = T)
```

Description

MSPRT is designed on the assumption that we can afford at most, say, N samples. This function calculates a summary of the Type 1 or Type 2 error committed by the Wald's SPRT when it is simply truncated at N in two-sample Z-tests. This is done using parallel computation.

It is worth a mention that a case may remain inconclusive due to the truncation. The required sample size for reaching that decision is N.

Usage

error.type	a character; specifies which of the 2 types of errors need to be accounted for. "type1" for Type 1 error. "type2" for Type 2 error.
batch1.seq	a numeric vector; an increasing sequence of values until N1. Denotes the se- quence of sample sizes where data is observed sequentially from Group-1. Last element should equal be to N1.
batch2.seq	a numeric vector; an increasing sequence of values until N2. Denotes the se- quence of sample sizes where data is observed sequentially from Group-2. Last element should equal be to N2.
gen.par	a numeric; observations from Group-1 and 2 are generated from the normal dis- tributions with common standard deviation gen.par[2], and means -gen.par[1] and gen.par[1], respectively.
alt.LR	a numeric; the simple alternative in favor of which the likelihood ratios are cal- culated sequentially. The UMPBT point alternative is used in case of a MSPRT. This is same with the output u from umpbt.twoZ().
up	a numeric; value of a constant rejection threshold. Should be greater than low.
low	a numeric; value of a constant acceptance threshold. Should be smaller than up.
N1	a positive numeric (integer); maximum available number of samples from Group-1.
N2	a positive numeric (integer); maximum available number of samples from Group-2.
R	a positive numeric (integer); number of replications desired in the Monte Carlo study.
	At least 1e+5 is required.

core.no	a numeric; number of cores this function can use for carrying out the Monte Carlo study using the parallel computing.
return.n	logical; if TRUE, this returns a vector of sample sizes required for reaching a decision in each of the R replications.

Value

count	a numeric; number of error of error type those are committed out of ${\tt R}$ replications.	
inconclusive.vec		
	a numeric vector; a vector containing the likelihood ratio values at N which remained inconclusive at the last stage.	
n.vec	a numeric vector; a vector of the required number of samples in each replications. This vector has length ${\sf R}.$	

If return.n = FALSE, the same list except n.vec is returned.

If return.n = TRUE, a list with following components is returned:

Author(s)

Sandipan Pramanik, Valen E. Johnson and Anirban Bhattacharya

References

Wald, A., Sequential Tests of Statistical Hypotheses. Ann. of Math. Statist., vol. 16, no. 2, 1945, 117-186.

```
N1.max = 30
N2.max = 30
#overshoot.twoZ( error.type= "type1", batch1.seq= 1:N1.max, batch2.seq= 1:N2.max,
# gen.par= c(0,1), alt.LR = 1, up= 160, low= 0.2,
# N1= N1.max, N2= N2.max, R= 1e+6, core.no= 2, return.n = T)
#overshoot.twoZ( error.type= "type1", batch1.seq= 1:N1.max, batch2.seq= 1:N2.max,
# gen.par= c(1,1), alt.LR = 1, up= 160, low= 0.2,
# N1= N1.max, N2= N2.max, R= 1e+6, core.no= 2, return.n = T)
```

Description

In one-sample proportion tests this function simulates a data, computes the weighted likelihood ratios, and compares with the acceptance and rejection thresholds. overshoot.oneProp() carries out a Monte Carlo method by repeating this function for R number of times.

Usage

error.type	a character; specifies which of the 2 types of errors need to be accounted for.
	"type1" for Type 1 error.
	"type2" for Type 2 error.
batch.seq	a numeric vector; an increasing sequence of values until N. Denotes the sequence of sample sizes where a user will observe data sequentially.
	Last element should equal to N.
null	a numeric in (0,1); the hypothesized value of proportion under the simple null hypothesis.
gen.par	a numeric; the value of proportion from which the data needs to be generated from.
alt.LR	a numeric vector of lenth 2; this consists of the 2 UMPBT alternative points. The sequence of weighted likelihood ratios (L_n) is computed in favour of this alternative.
	This is same with the output u from umpbt.oneProp().
alt.psi	a numeric in $(0, 1)$; the mixing probability corresponding to the first component of alt.LR in the UMPBT alternative.
	This is same with the output psi from umpbt.oneProp().
up	a numeric; value of a constant rejection threshold. Should be greater than low.
low	a numeric; value of a constant acceptance threshold. Should be smaller than up.
Ν	a positive numeric (integer); number of samples where truncation of Wald's SPRT is required.
	In a MSPRT, this is the maximum available sample size.
seed	a positive integer; used in set.seed() to recreate the simulated data.

Value

Returns a list with following components:

incr.count	either 0 or 1; 1 if and only if an error of error.type is made.
inconclusive	a numeric; the value of L_N if and only if it remains inconclusive after truncating Wald's SPRT at N; otherwise a numeric of length 0 is returned.
n	a numeric; number of samples required for reaching the decision. In an inconclusive case, this value is $N.$

Author(s)

Sandipan Pramanik, Valen E. Johnson and Anirban Bhattacharya

References

Wald, A., Sequential Tests of Statistical Hypotheses. Ann. of Math. Statist., vol. 16, no. 2, 1945, 117-186.

Examples

ovr.repl.oneT

A particular replication step in overshoot.oneT()

Description

In one-sample T-tests this function simulates a data, computes the bayes factors, and compares with the acceptance and rejection thresholds. overshoot.oneT() carries out a Monte Carlo method by repeating this function for R number of times.

Usage

ovr.repl.oneT

Arguments

side	a character; direction of the alternative hypothesis H1. Has to be one of "right" or "left".
error.type	a character; specifies which of the 2 types of errors need to be accounted for. "type1" for Type 1 error. "type2" for Type 2 error.
batch.seq	a numeric vector; an increasing sequence of values until N. Denotes the sequence of sample sizes where a user will observe data sequentially.
	First element should be at least 2. Last element should equal to N.
type1	a numeric in $(0, 1)$; the probability at which we want to control the Type 1 error of the MSPRT.
null	a numeric; the hypothesized value of population mean under the simple null hypothesis.
gen.par	a numeric; the value of population mean from which normal observations need to be generated from.
up	a numeric; value of a constant rejection threshold. Should be greater than low.
low	a numeric; value of a constant acceptance threshold. Should be smaller than up.
Ν	a positive numeric (integer); number of samples where truncation of Wald's SPRT is required.
	In a MSPRT, this is the maximum available sample size.
seed	a positive integer; used in set.seed() to recreate the simulated data.

Value

Returns a list with following components:

incr.count	either 0 or 1; 1 if and only if an error of error.type is made.
inconclusive	a numeric; the value of L_N if and only if it remains inconclusive after truncating Wald's SPRT at N; otherwise a numeric of length 0 is returned.
n	a numeric; number of samples required for reaching the decision. In an inconclusive case, this value is N.

Author(s)

Sandipan Pramanik, Valen E. Johnson and Anirban Bhattacharya

References

Wald, A., Sequential Tests of Statistical Hypotheses. Ann. of Math. Statist., vol. 16, no. 2, 1945, 117-186.

Examples

```
N.max = 30
ovr.repl.oneT( side = "right", error.type= "type1", batch.seq= 2:N.max,
        type1 = 0.005, null= 0, gen.par= 0, up= 160, low= 0.2,
        N= N.max, seed= 1)
ovr.repl.oneT( side = "right", error.type= "type2", batch.seq= 2:N.max,
        type1 = 0.005, null= 0, gen.par= 1.5, up= 160, low= 0.2,
        N= N.max, seed= 1)
```

ovr.repl.oneZ

A particular replication step in overshoot.oneZ()

Description

In one-sample Z-tests this function simulates a data, computes the likelihood ratios, and compares with the acceptance and rejection thresholds. overshoot.oneZ() carries out a Monte Carlo method by repeating this function for R number of times.

Usage

ovr.repl.oneZ(error.type, batch.seq, null, gen.par, alt.LR, up, low, N, seed)

error.type	a character; specifies which of the 2 types of errors need to be accounted for. "type1" for Type 1 error. "type2" for Type 2 error.
batch.seq	a numeric vector; an increasing sequence of values until N. Denotes the sequence of sample sizes where a user will observe data sequentially. Last element should equal to N.
null	a numeric; the hypothesized value of population mean under the simple null hypothesis.
gen.par	a numeric vector of length 2; the first component is the value of the population mean and second component is the known standard deviation (sd).
	Observations are generated from a normal distribution with this mean and sd.
alt.LR	a numeric; the simple alternative in favor of which the likelihood ratios (L_n) are calculated sequentially.
	The UMPBT point alternative is used in case of a MSPRT. This is same with the output u from umpbt.oneZ().
up	a numeric; value of a constant rejection threshold; should be greater than low.
low	a numeric; value of a constant acceptance threshold; should be smaller than up.

ovr.repl.twoT

Ν	a positive numeric (integer); number of samples where truncation of Wald's SPRT is required;
	in a MSPRT, this is the maximum available sample size.
seed	a positive integer; used in set.seed() to recreate the simulated data.

Value

Returns a list with following components:

incr.count	either 0 or 1; 1 if and only if an error of error.type is made.
inconclusive	a numeric; the value of L_N if and only if it remains inconclusive after truncating Wald's SPRT at N; otherwise a numeric of length 0 is returned.
n	a numeric; number of samples required for reaching the decision. In an inconclusive case, this value is $N.$

Author(s)

Sandipan Pramanik, Valen E. Johnson and Anirban Bhattacharya

References

Wald, A., Sequential Tests of Statistical Hypotheses. Ann. of Math. Statist., vol. 16, no. 2, 1945, 117-186.

Examples

```
N.max = 30
ovr.repl.oneZ( error.type= "type1", batch.seq= 1:N.max, null= 0,
    gen.par= c(0,1), alt.LR= 1, up= 160, low= 0.2,
    N= N.max, seed= 1)
ovr.repl.oneZ( error.type= "type2", batch.seq= 1:N.max, null= 0,
    gen.par= c(1.5,1), alt.LR= 1, up= 160, low= 0.2,
    N= N.max, seed= 1)
```

ovr.repl.twoT

A particular replication step in overshoot.twoT()

Description

In two-sample T-tests this function simulates a data, computes the bayes factors, and compares with the acceptance and rejection thresholds. overshoot.twoT() carries out a Monte Carlo method by repeating this function for R number of times.

Usage

Arguments

side	a character; direction of the alternative hypothesis H1.
	Has to be one of "right" or "left".
error.type	a character; specifies which of the 2 types of errors need to be accounted for.
	"type1" for Type 1 error.
	"type2" for Type 2 error.
batch1.seq	a numeric vector; an increasing sequence of values until N1. Denotes the se- quence of sample sizes where data is observed sequentially from Group-1.
	First element should be at least 2. Last element should equal be to N1.
batch2.seq	a numeric vector; an increasing sequence of values until N2. Denotes the se- quence of sample sizes where data is observed sequentially from Group-2.
	First element should be at least 2. Last element should equal be to N2.
type1	a numeric in $(0, 1)$; the probability at which we want to control the Type 1 error of the MSPRT.
gen.par	a numeric; observations from Group-1 and 2 are generated from the normal distributions with common variance 1, and means -gen.par and gen.par, respectively.
up	a numeric; value of a constant rejection threshold. Should be greater than low.
low	a numeric; value of a constant acceptance threshold. Should be smaller than up.
N1	a positive numeric (integer); maximum available number of samples from Group-1.
N2	a positive numeric (integer); maximum available number of samples from Group-2.
seed	a positive integer; used in set.seed() to recreate the simulated data.

Value

Returns a list with following components:

incr.count	either 0 or 1; 1 if and only if an error of error.type is made.
inconclusive	a numeric; the value of L_N if and only if it remains inconclusive after truncating Wald's SPRT at N; otherwise a numeric of length 0 is returned.
n	a numeric; number of samples required for reaching the decision. In an incon- clusive case, this value is N.

Author(s)

Sandipan Pramanik, Valen E. Johnson and Anirban Bhattacharya

ovr.repl.twoZ

References

Wald, A., Sequential Tests of Statistical Hypotheses. Ann. of Math. Statist., vol. 16, no. 2, 1945, 117-186.

Examples

ovr.repl.twoZ A particular replication step in overshoot.twoZ()

Description

In two-sample Z-tests this function simulates a data, computes the likelihood ratios, and compares with the acceptance and rejection thresholds. overshoot.twoZ() carries out a Monte Carlo method by repeating this function for R number of times.

Usage

error.type	a character; specifies which of the 2 types of errors need to be accounted for.
	"type1" for Type 1 error.
	"type2" for Type 2 error.
batch1.seq	a numeric vector; an increasing sequence of values until N1. Denotes the se- quence of sample sizes where data is observed sequentially from Group-1.
	Last element should equal be to N1.
batch2.seq	a numeric vector; an increasing sequence of values until N2. Denotes the se- quence of sample sizes where data is observed sequentially from Group-2.
	Last element should equal be to N2.

gen.par	a numeric; observations from Group-1 and 2 are generated from the normal dis- tributions with common standard deviation gen.par[2], and means -gen.par[1] and gen.par[1], respectively.
alt.LR	a numeric; the simple alternative in favor of which the likelihood ratios are cal- culated sequentially.
	The UMPBT point alternative is used in case of a MSPRT. This is same with the output u from umpbt.twoZ().
up	a numeric; value of a constant rejection threshold. Should be greater than low.
low	a numeric; value of a constant acceptance threshold. Should be smaller than up.
N1	a positive numeric (integer); maximum available number of samples from Group-1.
N2	a positive numeric (integer); maximum available number of samples from Group-2.
seed	a positive integer; used in set.seed() to recreate the simulated data.

Value

Returns a list with following components:

incr.count	either 0 or 1; 1 if and only if an error of error.type is made.
inconclusive	a numeric; the value of L_N if and only if it remains inconclusive after truncating Wald's SPRT at N; otherwise a numeric of length 0 is returned.
n	a numeric; number of samples required for reaching the decision. In an inconclusive case, this value is N.

Author(s)

Sandipan Pramanik, Valen E. Johnson and Anirban Bhattacharya

References

Wald, A., Sequential Tests of Statistical Hypotheses. Ann. of Math. Statist., vol. 16, no. 2, 1945, 117-186.

```
ovr.repl.twoZ( error.type= "type2", batch1.seq= 1:N1.max, batch2.seq= 1:N2.max,
    gen.par= c(1,1), alt.LR = 1, up= 160, low= 0.2,
    N1= N1.max, N2= N2.max, seed= 1)
```

point.umpbt.oneProp The UMPBT point alternative in one-sample proportion tests

Description

This function finds the UMPBT point alternative, as defined in Johnson (2013), in case of onesample proportion tests. This is obtained by matching the rejection region of the UMPBT to that of the UMP (or fixed design) test.

Usage

```
point.umpbt.oneProp(side = "right", type1 = 0.005, n, null = 0.5)
```

Arguments

side	a character; direction of the alternative hypothesis H1.
	Has to be one of "right" or "left".
	Default: "right".
type1	a numeric in (0,1); the prespecified Type 1 error probability.
	Default: 0.005.
n	a positive integer; number of samples to be used.
null	a numeric in (0,1); the hypothesized value of proportion under the simple null
	hypothesis.
	Default is 0.5.

Value

Returns a numeric which is the UMPBT point alternative as defined in Johnson (2013).

Author(s)

Sandipan Pramanik, Valen E. Johnson and Anirban Bhattacharya

References

Johnson, Valen E., Uniformly most powerful Bayesian tests., Ann. of Stat., 41, (4), 2013, pp. 1716-1741

```
point.umpbt.oneProp(n= 60, null= .2)
point.umpbt.oneProp(side= "left", n= 60, null= .2)
```

type2.error.oneProp Type 2 error function of one-sample proportion tests in a fixed design

Description

For one-sample proportion tests in a fixed design, this function evaluates (Type 2 error - a constant) at a specified alternative value of proportion.

Usage

```
type2.error.oneProp(alt, side = "right", null = 0.5, n, type1 = 0.005, root = 0)
```

Arguments

alt	a numeric in $(0,1)$; the value of proportion (consistent with side) where the Type 2 error of the fixed design test needs to be evaluated at.
side	a character; direction of the alternative hypothesis H1.
	Has to be one of "right" or "left".
	Default: "right".
null	a numeric in $(0,1)$; the hypothesized value of proportion under a simple null hypothesis.
	Default: 0.5.
n	a positive numeric (integer); sample size to be used.
type1	a numeric in (0,1); prespecified Type 1 error probability.
	Default: 0.005.
root	a numeric; when this is 0, the Type 2 error is returned. In general, (Type 2 error -root) is returned.
	Default: 0.

Details

In case of one-sample proportion tests in a fixed design, this function evaluates the Type 2 error at a specified value alt. We can also use this function to do the other way round by exploiting the argument root; that is, given a Type 2 error β , we can obtain the alt where Type 2 error equals β . To do that, we need to substitute root= β in the argument of this function, and then solve it for alt. The function find.alt() in this package excatly does this.

Value

If root=k, a numeric (Type 2 error -k) evaluated at the speified alternative value alt is returned.

Author(s)

Sandipan Pramanik, Valen E. Johnson and Anirban Bhattacharya

type2.error.oneT

Examples

```
## Type 2 error at an alternative value
type2.error.oneProp(alt= 0.5, null= 0.2, n= 60)
## (Type 2 error - 0.5) at the same alternative value
type2.error.oneProp(alt= 0.5, null= 0.2, n= 60, root = 0.5)
```

type2.error.oneT Type 2 error function of one-sample T-tests in a fixed design

Description

For a one-sample T-test in a fixed design, this function evaluates (Type 2 error - a constant) at a specified alternative value of population mean.

Usage

```
type2.error.oneT(alt, side = "right", null = 0, n, type1 = 0.005, root = 0)
```

Arguments

alt	a numeric; the value of population mean (consistent with side) where the Type 2 error of the fixed design test needs to be evaluated at.
side	a character; direction of the alternative hypothesis H1.
	Has to be one of "right" or "left".
	Default: "right".
null	a numeric; the hypothesized value of population mean under a simple null hypothesis.
	Default: 0.
n	a positive numeric (integer); sample size to be used.
type1	a numeric in (0,1); prespecified Type 1 error probability.
	Default: 0.005.
root	a numeric; when this is 0, the Type 2 error is returned;
	in general, (Type 2 error -root) is returned
	Default: 0.

Details

In case of one-sample T-tests in a fixed design, this function evaluates the Type 2 error at a specified value alt. We can also use this function to do the other way round by exploiting the argument root; that is, given a Type 2 error β , we can obtain the alt where Type 2 error equals β . To do that, we need to substitute root= β in the argument of this function, and then solve it for alt. The function find.alt() in this package excatly does this.

If root=k, a numeric (Type 2 error -k) evaluated at the speified alternative value alt is returned.

Author(s)

Sandipan Pramanik, Valen E. Johnson and Anirban Bhattacharya

Examples

```
## Type 2 error at an alternative value
type2.error.oneT(alt= 1.2, n= 60)
## (Type 2 error - 0.5) at the same alternative value
type2.error.oneT(alt= 1.2, n= 60, root = 0.5)
```

type2.error.oneZ Type 2 error function of one-sample Z-tests in a fixed design

Description

For one-sample Z-tests in a fixed design, this function evaluates (Type 2 error - a constant) at a specified alternative value of population mean.

Usage

alt	a numeric; the value of population mean (consistent with side) where the Type 2 error of the fixed design test needs to be evaluated at.
side	a character; direction of the alternative hypothesis H1.
	Has to be one of "right" or "left".
	Default: "right".
null	a numeric; the hypothesized value of population mean under a simple null hypothesis.
	Default: 0.
sigma0	a positive numeric; the known population standard deviation.
	Default: 1.
n	a positive numeric (integer); sample size to be used.
type1	a numeric in (0,1); prespecified Type 1 error probability.
	Default: 0.005.
root	a numeric; when this is 0, the Type 2 error is returned;
	in general, (Type 2 error -root) is returned
	Default: 0.

type2.error.twoT

Details

In case of one-sample Z-tests in a fixed design, this function evaluates the Type 2 error at a specified value alt. We can also use this function to do the other way round by exploiting the argument root; that is, given a Type 2 error β , we can obtain the alt where Type 2 error equals β . To do that, we need to substitute root= β in the argument of this function, and then solve it for alt. The function find.alt() in this package excatly does this.

Value

If root=k, a numeric (Type 2 error -k) evaluated at the speified alternative value alt is returned.

Author(s)

Sandipan Pramanik, Valen E. Johnson and Anirban Bhattacharya

Examples

Type 2 error at an alternative value
type2.error.oneZ(alt=1.2, n= 60)

```
## (Type 2 error - 0.5) at the same alternative value type2.error.oneZ(alt=1.2, n= 60, root = 0.5)
```

type2.error.twoT Type 2 error function of two-sample T-tests in a fixed design

Description

For a two-sample T-test in a fixed design, this function evaluates (Type 2 error - a constant) at a specified alternative value of the hypothesized parameter (the difference between the population means of Group-2 and Group-1). The hypothesized value under the simple null hypothesis is set at 0.

Usage

```
type2.error.twoT(alt, side = "right", n1, n2, type1 = 0.005, root = 0)
```

a numeric; the value of hypothesized parameter (consistent with side) where the Type 2 error of the fixed design test needs to be evaluated at.
a character; direction of the alternative hypothesis H1. Has to be one of "right" or "left".
Default: "right".
a positive numeric (integer); sample size from Group-1 to be used.
a positive numeric (integer); sample size from Group-2 to be used.

type1	a numeric in $(0, 1)$; prespecified Type 1 error probability.
	Default: 0.005.
root	a numeric; when this is 0, the Type 2 error is returned;
	in general, (Type 2 error -root) is returned
	Default: 0.

Details

In case of two-sample T-tests in a fixed design, this function evaluates the Type 2 error at a specified value alt. We can also use this function to do the other way round by exploiting the argument root; that is, given a Type 2 error β , we can obtain the alt where Type 2 error equals β . To do that, we need to substitute root= β in the argument of this function, and then solve it for alt. The function find.alt() in this package excatly does this.

Value

If root=k, a numeric (Type 2 error -k) evaluated at the speified alternative value alt is returned.

Author(s)

Sandipan Pramanik, Valen E. Johnson and Anirban Bhattacharya

Examples

Type 2 error at an alternative value
type2.error.twoT(alt= 1.2, n1= 60, n2= 60)

(Type 2 error - 0.5) at the same alternative value type2.error.twoT(alt= 1.2, n1= 60, n2= 60, root = 0.5)

type2.error.twoZ Type 2 error function of two-sample Z-tests in a fixed design

Description

For a two-sample Z-test in a fixed design, this function evaluates (Type 2 error - a constant) at a specified alternative value of the hypothesized parameter (the difference between the population means of Group-2 and Group-1). The hypothesized value under the simple null hypothesis is set at 0.

Usage

```
type2.error.twoZ(alt, side = "right", sigma0 = 1, n1, n2, type1 = 0.005, root = 0)
```

type2.error.twoZ

Arguments

alt	a numeric; the value of hypothesized parameter (consistent with side) where the Type 2 error of the fixed design test needs to be evaluated at.
side	a character; direction of the alternative hypothesis H1.
	Has to be one of "right" or "left".
	Default: "right".
sigma0	a positive numeric; the known common population standard deviation.
	Default: 1.
n1	a positive numeric (integer); sample size from Group-1 to be used.
n2	a positive numeric (integer); sample size from Group-2 to be used.
type1	a numeric in (0,1); prespecified Type 1 error probability.
	Default: 0.005.
root	a numeric; when this is 0, the Type 2 error is returned;
	in general, (Type 2 error -root) is returned
	Default: 0.

Details

In case of two-sample Z-tests in a fixed design, this function evaluates the Type 2 error at a specified value alt. We can also use this function to do the other way round by exploiting the argument root; that is, given a Type 2 error β , we can obtain the alt where Type 2 error equals β . To do that, we need to substitute root= β in the argument of this function, and then solve it for alt. The function find.alt() in this package excatly does this.

Value

If root=k, a numeric (Type 2 error -k) evaluated at the speified alternative value alt is returned.

Author(s)

Sandipan Pramanik, Valen E. Johnson and Anirban Bhattacharya

```
## Type 2 error at an alternative value
type2.error.twoZ(alt= 1.2, n1= 60, n2= 60)
## (Type 2 error - 0.5) at the same alternative value
type2.error.twoZ(alt= 1.2, n1= 60, n2= 60, root = 0.5)
```

ump.match.oneProp

Description

In one-sample proportion tests in a fixed design, this function solves for δ by matching the rejection region from the UMPBT with that of the corresponding UMP (fixed design) test. Basically, this solves equation (20) in the supplemental information.

Usage

```
ump.match.oneProp(side = "right", type1 = 0.005, n, p0 = 0.5)
```

Arguments

side	a character; direction of the alternative hypothesis H1.
	Has to be one of "right" or "left".
	Default: "right".
type1	a numeric in (0,1); prespecified Type 1 error probability.
	Default: 0.005.
n	a positive numeric (integer); sample size to be used.
p0	a numeric in (0,1); the hypothesized value of proportion under the simple null hypothesis.
	Default is 0.5.

Author(s)

Sandipan Pramanik, Valen E. Johnson and Anirban Bhattacharya

References

MSPRT: Supplemental information

Johnson, Valen E., Uniformly most powerful Bayesian tests., Ann. of Stat., 41, (4), 2013, pp. 1716-1741

Examples

ump.match.oneProp(n= 60, p0= .2)

umpbt.oneProp

The UMPBT alternative used in the MSPRT in one-sample proportion tests

Description

This function finds the UMPBT alternative, a 2-points mixture distribution, used in a MSPRT design in one-sample proportion tests (Table 1 in the main article). This is obtained by matching the rejection region of the UMPBT to that of the randomized fixed design test. For more details please refer to the following references.

This is a slight modification of the UMPBT point alternative as originally defined in Johnson (2013). This point alternative can be calculated using point.umpbt.oneProp().

Usage

umpbt.oneProp(side = "right", type1 = 0.005, n, null = 0.5)

Arguments

side	a character; direction of the alternative hypothesis H1.
	Has to be one of "right" or "left".
	Default: "right".
type1	a numeric in (0,1); the prespecified Type 1 error probability.
	Default: 0.005.
n	a positive integer; number of samples to be used.
null	a numeric in (0,1); the hypothesized value of proportion under the simple null
	hypothesis.
	Default is 0.5.

Details

The UMPBT alternative used in the MSPRT in one-sample proportion tests is a mixture distribution with two points. This function returns those two points and the mixing probability.

Value

Returns a list with the following two components:

u	a numeric vector of length 2; these are the two points of the mixture distribution.
psi	a numeric in (0,1); mixing probability corresponding to the first component of
	u.

Author(s)

Sandipan Pramanik, Valen E. Johnson and Anirban Bhattacharya

References

MSPRT: main article and supplemental information

Johnson, Valen E., Uniformly most powerful Bayesian tests., Ann. of Stat., 41, (4), 2013, pp. 1716-1741

Johnson, Valen E., Revised standards for statistical evidence., Proceedings of the National Academy of Sciences, 16, 1945. (Specifically, it's supplemental file)

Examples

```
# the point UMPBT alternative according to Johnson (2013)
point.umpbt.oneProp(n= 60, null= .2)
point.umpbt.oneProp(side= "left", n= 60, null= .2)
# the UMPBT alternative used by the MSPRT in these cases
umpbt.oneProp(n= 60, null= .2)
umpbt.oneProp(side= "left", n= 60, null= .2)
```

```
umpbt.oneT
```

The UMPBT alternative in one-sample T-tests

Description

This function finds the approximate data dependent UMPBT alternative (Table 1 in the main article) in one-sample T-tests. For more details please refer to the following references.

Usage

umpbt.oneT(side = "right", type1 = 0.005, n, null = 0, obs, s)

Arguments

side	a character; direction of the alternative hypothesis H1.
	Has to be one of "right" or "left".
	Default: "right".
type1	a numeric in (0,1); prespecified Type 1 error probability.
	Default: 0.005.
n	a positive numeric (integer); sample size to be used.
null	a numeric; the hypothesized value of population mean under the simple null hypothesis.
	Default: 0.
obs	a numeric vector; the vector of observations based on which the alternative needs to be calculated. This is ignored if s is provided.
S	a positive numeric; the sample standard deviation (sd) (of divisor (n-1)) of the obs.
	Can be missing if obs is provided.

60

umpbt.oneZ

Details

We need either obs or s.

When we are implementing the MSPRT in one-sample T-test and we need the alternative at Step-5, this function requires all the data observed until Step-5 in the order they were observed.

Value

Returns a numeric which is the UMPBT alternative in the one-sample T-test.

Author(s)

Sandipan Pramanik, Valen E. Johnson and Anirban Bhattacharya

References

MSPRT: main article and supplemental information

Johnson, Valen E., Uniformly most powerful Bayesian tests., Ann. of Stat., 41, (4), 2013, pp. 1716-1741

Johnson, Valen E., Revised standards for statistical evidence., Proceedings of the National Academy of Sciences, 16, 1945. (Specially it's supplemental file)

Examples

```
# a simulated ordered data at step-30
x.seq = rnorm(30,2,1.5)
# UMPBT alternative at step-30
## providing the data x.seq
umpbt.oneT(n= 60, obs= x.seq)
## providing the sd of x.seq
umpbt.oneT(n= 60, s= sd(x.seq))
```

umpbt.oneZ

The UMPBT alternative in one-sample Z-tests

Description

This function finds the UMPBT alternative (Table 1 in the main article) in one-sample Z-tests. This is obtained by matching the rejection region of the UMPBT to that of the fixed design test. For more details please refer to the following references.

Usage

```
umpbt.oneZ(side = "right", type1 = 0.005, n, null = 0, sigma0 = 1)
```

Arguments

side	a character; direction of the alternative hypothesis H1.
	Has to be one of "right" or "left".
	Default: "right".
type1	a numeric in (0,1); prespecified Type 1 error probability.
	Default: 0.005.
n	a positive numeric (integer); sample size to be used.
null	a numeric; the hypothesized value of population mean under the simple null hypothesis.
	Default: 0.
sigma0	a positive numeric; the known population standard deviation.
	Default: 1.

Value

Returns a numeric which is the UMPBT point alternative in the one-sample Z-test.

Author(s)

Sandipan Pramanik, Valen E. Johnson and Anirban Bhattacharya

References

MSPRT: main article and supplemental information

Johnson, Valen E., Uniformly most powerful Bayesian tests., Ann. of Stat., 41, (4), 2013, pp. 1716-1741

Johnson, Valen E., Revised standards for statistical evidence., Proceedings of the National Academy of Sciences, 16, 1945. (Specially it's supplemental file)

Examples

umpbt.oneZ(n= 60)

umpbt.twoT

The UMPBT alternative in two-sample T-tests

Description

This function finds the approximate data dependent UMPBT alternative in two-sample T-tests. The value of hypothesized parameter, the difference between the population means of Group-2 and Group-1, under the simple null hypothesis is set at 0.

Usage

```
umpbt.twoT(side = "right", type1 = 0.005, n1, n2, obs1, obs2, s)
```

umpbt.twoT

Arguments

side	a character; direction of the alternative hypothesis H1.
	Has to be one of "right" or "left".
	Default: "right".
type1	a numeric in (0,1); prespecified Type 1 error probability.
	Default: 0.005.
n1	a positive numeric (integer); sample size from Group-1 to be used.
n2	a positive numeric (integer); sample size from Group-2 to be used.
obs1	a numeric vector; the vector of observations from Group-1 based on which the alternative is calculated.
obs2	a numeric vector; the vector of observations from Group-2 based on which the alternative is calculated.
S	a positive numeric; the pooled sample standard deviation (sd) based on obs1 and obs2.
	Can be missing if obs1 and obs2 are provided.

Details

We need either obs1 & obs2, or s.

When we are implementing the MSPRT in a two-sample T-test and we need the alternative at Step-5, this function requires all the data from both groups observed until that step in the order they were observed.

Value

Returns a numeric which is the UMPBT alternative in the two-sample T-test.

Author(s)

Sandipan Pramanik, Valen E. Johnson and Anirban Bhattacharya

References

MSPRT: main article and supplemental information

Johnson, Valen E., Uniformly most powerful Bayesian tests., Ann. of Stat., 41, (4), 2013, pp. 1716-1741

Johnson, Valen E., Revised standards for statistical evidence., Proceedings of the National Academy of Sciences, 16, 1945. (Specially it's supplemental file)

```
# suppose we get data from both groups after each observation
# a simulated ordered data at Step-30
x1.seq = rnorm(30,2,1.5)
x2.seq = rnorm(30,2,1.5)
```

```
## UMPBT alternative at step-30
# providing the data x1.seq & x2.seq
umpbt.twoT(n1= 60, n2= 60, obs1= x1.seq, obs2= x2.seq)
```

umpbt.twoZ

```
The UMPBT alternative in two-sample Z-tests
```

Description

This function finds the UMPBT alternative in two-sample Z-tests. The value of hypothesized parameter, the difference between the population means of Group-2 and Group-1, under the simple null hypothesis is set at 0.

Usage

umpbt.twoZ(side = "right", type1 = 0.005, n1, n2, sigma0 = 1)

Arguments

side	a character; direction of the alternative hypothesis H1.
	Has to be one of "right" or "left".
	Default: "right".
type1	a numeric in (0,1); prespecified Type 1 error probability.
	Default: 0.005.
n1	a positive numeric (integer); sample size from Group-1 to be used.
n2	a positive numeric (integer); sample size from Group-2 to be used.
sigma0	a positive numeric; the known common population standard deviation.
	Default: 1.

Value

Returns a numeric which is the UMPBT alternative in the two-sample Z-test.

Author(s)

Sandipan Pramanik, Valen E. Johnson and Anirban Bhattacharya

References

MSPRT: main article and supplemental information

Johnson, Valen E., Uniformly most powerful Bayesian tests., Ann. of Stat., 41, (4), 2013, pp. 1716-1741

Johnson, Valen E., Revised standards for statistical evidence., Proceedings of the National Academy of Sciences, 16, 1945. (Specially it's supplemental file)

Examples

umpbt.twoZ(n1= 60, n2= 60)

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