

# Package ‘BHTSpack’

September 10, 2018

**Type** Package

**Title** Bayesian Multi-Plate High-Throughput Screening of Compounds

**Version** 0.5

**Description** Can be used for joint identification of candidate compound hits from multiple assays, in drug discovery. This package implements the framework of I. D. Shterev, D. B. Dunson, C. Chan and G. D. Sempowski. “Bayesian Multi-Plate High-Throughput Screening of Compounds”, Scientific Reports 8(1):9551, 2018. This project was funded by the Division of Allergy, Immunology, and Transplantation, National Institute of Allergy and Infectious Diseases, National Institutes of Health, Department of Health and Human Services, under contract No. HHSN272201400054C entitled “Adjuvant Discovery For Vaccines Against West Nile Virus and Influenza”, awarded to Duke University and lead by Drs. Herman Staats and Soman Abraham.

**Depends** R (>= 3.2.3), R2HTML (>= 2.3.2), xtable (>= 1.8-2)

**VignetteBuilder** knitr

**Suggests** knitr

**License** GPL-3

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**NeedsCompilation** yes

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BHTSpack-package

*Bayesian Multi-Plate High-Throughput Screening of Compounds*

---

## Description

Can be used for joint identification of candidate hits from multiple assays, in drug discovery. This package implements the framework of I. D. Shterev, D. B. Dunson, C. Chan and G. D. Sempowski. "Bayesian Multi Plate High Throughput Screening of Compounds", arXiv:1709.10041, September 2017. This project was funded by the Division of Allergy, Immunology, and Transplantation, National Institute of Allergy and Infectious Diseases, National Institutes of Health, Department of Health and Human Services, under contract No. HHSN272201400054C entitled "Adjuvant Discovery For Vaccines Against West Nile Virus and Influenza", awarded to Duke University and lead by Drs. Herman Staats and Soman Abraham.

## Details

The DESCRIPTION file:

```

Package:      BHTSpack
Type:         Package
Title:        Bayesian Multi-Plate High-Throughput Screening of Compounds
Version:      0.5
Authors@R:    c(person(c("Ivo", "D."), "Shterev", role = c("aut", "cre"), email = "i.shterev@duke.edu"), person(c("David", "Dunson", "D."), "Dunson", role = c("aut", "cre"), email = "dunson@duke.edu"), person(c("Chan", "Chun", "C."), "Chan", role = c("aut", "cre"), email = "chan@duke.edu"), person(c("Sempowski", "G. D."), "Sempowski", role = c("aut", "cre"), email = "gds@duke.edu"))
Description:   Can be used for joint identification of candidate compound hits from multiple assays, in drug discovery. This package implements the framework of I. D. Shterev, D. B. Dunson, C. Chan and G. D. Sempowski. "Bayesian Multi Plate High Throughput Screening of Compounds", arXiv:1709.10041, September 2017. This project was funded by the Division of Allergy, Immunology, and Transplantation, National Institute of Allergy and Infectious Diseases, National Institutes of Health, Department of Health and Human Services, under contract No. HHSN272201400054C entitled "Adjuvant Discovery For Vaccines Against West Nile Virus and Influenza", awarded to Duke University and lead by Drs. Herman Staats and Soman Abraham.
Depends:      R (>= 3.2.3), R2HTML (>= 2.3.2), xtable (>= 1.8-2)
VignetteBuilder: knitr
Suggests:     knitr

```

License: GPL-3  
 LazyLoad: yes  
 Author: Ivo D. Shterev [aut, cre], David B. Dunson [aut], Cliburn Chan [aut], Gregory D. Sempowski [aut]  
 Maintainer: Ivo D. Shterev <i.shterev@duke.edu>

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#### Author(s)

I. D. Shterev, D. B. Dunson, C. Chan and G. D. Sempowski  
 Maintainer: I. D. Shterev <i.shterev@duke.edu>

#### References

I. D. Shterev, D. B. Dunson, C. Chan and G. D. Sempowski. "Bayesian Multi-Plate High-Throughput Screening of Compounds". *Scientific Reports*, 8(1):9551, 2018.

---

abfun *package internal function*

---

#### Description

package internal function

**Usage**

```
abfun(m, v)
```

**Arguments**

m	Description
v	Description

**Examples**

```
abfun(0.26, 10^-4)
```

---

alpha.u	<i>package internal function</i>
---------	----------------------------------

---

**Description**

package internal function

**Usage**

```
alpha.u(nu, a0, b0, H)
```

**Arguments**

nu	Description
a0	Description
b0	Description
H	Description

**Examples**

```
M = 5
H = 10
a = 10^-6
b = 10^-6
nu = lapply(1:M, function(x){rbeta(H, a, b)})
alpha.u(nu, a, b, H)
```

---

b.u *package internal function*

---

## Description

package internal function

## Usage

```
b.u(hatpai)
```

## Arguments

hatpai	Description
--------	-------------

## Examples

```
pai = 0.5
M = 10
H = 10
K = 5
n = 100

z = abs(rnorm(n))

sigma1 = abs(rnorm(K))
sigma0 = abs(rnorm(K))

mu1 = abs(rnorm(K))
mu0 = abs(rnorm(K))

hk0 = matrix(sample(K, M*H, replace=TRUE), M, H)
hk1 = matrix(sample(K, M*H, replace=TRUE), M, H)

nu.h0 = lapply(1:H, function(x){rbeta(1,5,5)})
nu.h1 = lapply(1:H, function(x){rbeta(1,5,5)})

ph0 = lapply(nu.h0, lambda.u)
ph1 = lapply(nu.h1, lambda.u)

b.u(hatpai.u(z, hk1, hk0, ph1, ph0, sigma1, sigma0, mu1, mu0, pai, H, n))
```

**Description**

This is the package main function.

**Usage**

```
bhts(Z, iters, H, K, mu00=NULL, mu10=NULL, a.alpha, b.alpha, a.tau, b.tau,
     pnorm=FALSE, s=NULL, store=FALSE)
```

**Arguments**

Z	A list of compounds.
iters	Number of iterations to perform.
H	Number of local DP components.
K	Number of global DP components.
mu00	Activity level (mean) of non-hit compounds
mu10	Activity level (mean) of hit compounds
a.alpha	Gamma shape parameter specifying local DP concentration prior.
b.alpha	Gamma rate parameter specifying local DP concentration prior.
a.tau	Gamma shape parameter specifying global DP concentration prior.
b.tau	Gamma rate parameter specifying global DP concentration prior.
pnorm	Plate normalization. If <i>TRUE</i> , each plate is normalized to zero mean and unit variance, prior to analysis. Default is <i>FALSE</i> .
s	Random seed (for reproducibility purposes). Default is <i>NULL</i> .
store	If <i>TRUE</i> , all samples of certain latent variables are stored in the output object. Default is <i>FALSE</i> .

**Value**

This function returns a list consisting of the following elements:

hatpai	A list of vectors of posterior probabilities, estimating the probability of a compound being a hit.
dat.store	If <i>store = TRUE</i> (default is <i>FALSE</i> ), the output contains a list of <i>iters</i> × <i>K</i> matrices of samples. Each matrix contains the samples of a separate latent variable. At each iteration, the following six variables are stored in a different row of their corresponding matrix, $(\lambda_1^{(0)}, \dots, \lambda_K^{(0)})$ , $(\lambda_1^{(1)}, \dots, \lambda_K^{(1)})$ , $(\mu_{01}, \dots, \mu_{0K})$ , $(\mu_{11}, \dots, \mu_{1K})$ , $(\sigma_{01}^2, \dots, \sigma_{0K}^2)$ and $(\sigma_{11}^2, \dots, \sigma_{1K}^2)$ .

**Examples**

```

set.seed(1234)
Nmax = 100
M = 100
n = sample(Nmax, M, replace=TRUE)
Z = lapply(n, function(x){abs(rnorm(x))})
bhts(Z, iters=100, H=10, K=5, mu00=0, mu10=10, a.alpha=10, b.alpha=5, a.tau=10, b.tau=5)

```

---

bhts2HTML

*Convert to HTML*


---

**Description**

This function creates an HTML file.

**Usage**

```
bhts2HTML(dat, dir, fname, title=NULL, bgcolor="#BBBBEE")
```

**Arguments**

dat	An object which is the output of <i>bhts()</i> .
dir	Directory in which to store the file.
fname	File name.
title	The title of the html file.
bgcolor	Color for the html background.

**Examples**

```
#See package vignette
```

---

data.create

*Create Synthetic Data*


---

**Description**

This function generates synthetic compound data.

**Usage**

```
data.create(N, nr, nc, M, p, s=NULL, covrow=NULL, covcol=NULL, c=0.0001, mat=FALSE)
```

**Arguments**

N	Number of compounds per plate.
nr	Number of plate rows.
nc	Number of plate columns.
M	Number of plates.
p	Probability of a compound being a hit.
s	Random seed (for reproducibility purposes). Default is <i>NULL</i> .
covrow	Noise plate row-covariance matrix. Default is <i>NULL</i> .
covcol	Noise plate column-covariance matrix. Default is <i>NULL</i> .
c	Constant for scaling plate noise. Default is 0.0001.
mat	Specifies a matrix ( <i>TRUE</i> ) or a vector ( <i>FALSE</i> ) plate format. Default is <i>FALSE</i> .

**Value**

This function returns a list consisting of the following elements:

Z	A list of matrices ( <i>mat = TRUE</i> ) or vectors ( <i>mat = FALSE</i> ) of compounds.
B	A list of compound indicators specifying a hit (1) or a non-hit (0).
I	A list of compound indicators specifying the mixture component (from 1 to <i>K</i> ).

**Examples**

```
#See package vignette
```

---

```
fdr.r           package internal function
```

---

**Description**

package internal function

**Usage**

```
fdr.r(r, hatpai, fdr)
```

**Arguments**

r	Description
hatpai	Description
fdr	Description

**Examples**

```
#See package vignette
```



---

h.pr.u                      *package internal function*

---

**Description**

package internal function

**Usage**

```
h.pr.u(z, ih, mu, sigma, pk, K, H, n)
```

**Arguments**

z  
ih  
mu  
sigma  
pk  
K  
H  
n

**Examples**

```
Nmax = 100  
K = 5  
H = 10  
M = 20  
n = sample(Nmax, M, replace=TRUE)  
  
z = abs(rnorm(sum(n)))  
mu = abs(rnorm(K))  
sigma = 1/rgamma(n=K, shape=10, rate=10)  
  
ih = sample(H, sum(n), replace=TRUE)  
  
pk = lambda.u(rbeta(K, 1, 1))  
  
h.pr.u(z, ih, mu, sigma, pk, K, H, n)
```

---

hatpai.u                    *package internal function*

---

**Description**

package internal function

**Usage**

```
hatpai.u(z, hk1, hk0, ph1, ph0, sigma1, sigma0, mu1, mu0, pai, H, n)
```

**Arguments**

z  
hk1  
hk0  
ph1  
ph0  
sigma1  
sigma0  
mu1  
mu0  
pai  
H  
n

**Value**

value

**Examples**

```
pai = 0.5  
M = 10  
H = 10  
K = 5  
n = 100  
  
z = abs(rnorm(n))  
  
sigma1 = abs(rnorm(K))  
sigma0 = abs(rnorm(K))  
  
mu1 = abs(rnorm(K))  
mu0 = abs(rnorm(K))
```

```
hk0 = matrix(sample(K, M*H, replace=TRUE), M, H)
hk1 = matrix(sample(K, M*H, replace=TRUE), M, H)

nu.h0 = lapply(1:H, function(x){rbeta(1,5,5)})
nu.h1 = lapply(1:H, function(x){rbeta(1,5,5)})

ph0 = lapply(nu.h0, lambda.u)
ph1 = lapply(nu.h1, lambda.u)

hatpai.u(z, hk1, hk0, ph1, ph0, sigma1, sigma0, mu1, mu0, pai, H, n)
```

---

ind.u *package internal function*

---

## Description

package internal function

## Usage

```
ind.u(pr)
```

## Arguments

pr

## Examples

```
Nmax = 100
K = 5
H = 10
M = 20
n = sample(Nmax, M, replace=TRUE)

z = abs(rnorm(sum(n)))
mu = abs(rnorm(K))
sigma = 1/rgamma(n=K, shape=10, rate=10)

hk = sample(K,M*H, replace=TRUE)

ph = as.vector(sapply(1:M, function(x){lambda.u(rbeta(H, 1, 1))}))

ind.u(z.pr.u(z, hk, mu, sigma, ph, H, n))
```

lambda.u *package internal function*

---

**Description**

package internal function

**Usage**

```
lambda.u(nu)
```

**Arguments**

nu

**Examples**

```
H = 5
nu = rbeta(H, 1, 1)
lambda.u(nu)
```

---

lg.mu.sig *package internal function*

---

**Description**

package internal function

**Usage**

```
lg.mu.sig(m, v)
```

**Arguments**

m	Description
v	Description

**Examples**

```
#See package vignette
```

---

`mu.k.u`*package internal function*

---

**Description**

package internal function

**Usage**`mu.k.u(k, ik, z, sigma, mu0)`**Arguments**`k``ik``z``sigma``mu0`**Value**

Describe

**Examples**

```
K = 5
n = 100
z = abs(rnorm(n))
sigma = sapply(1:K, function(x){1/rgamma(n=1, shape=10, rate=10)})
mu0 = 0
ik = sample(K, n, replace=TRUE)
sapply(1:K, mu.k.u, ik, z, sigma, mu0)
```

---

`nu.u`*package internal function*

---

**Description**

package internal function

**Usage**`nu.u(ind, tau, H)`

**Arguments**

ind  
tau  
H

**Value**

Describe

**Examples**

```
H = 5
n = 100
tau = rgamma(1, 1, 1)
ind = sample(H, n, replace=TRUE)
nu.u(ind, tau, H)
```

---

pai.u

*package internal function*

---

**Description**

package internal function

**Usage**

```
pai.u(b, a.pai, b.pai)
```

**Arguments**

b  
a.pai  
b.pai

**Value**

Describe

**Examples**

```
n = 100
b = rbinom(n, 1, 0.5)
a.pai = 10^-6
b.pai = 10^-6
pai.u(b, a.pai, b.pai)
```

---

ptrace *Trace (ACF) Plots*

---

**Description**

This function outputs trace plots of certain latent variables.

**Usage**

```
ptrace(res, var, ndisc, nr, nc, type="trace")
```

**Arguments**

**res** An output object from *bhts()*.

**var** Variable for which to display convergence diagnostic plots. Current options are *mu0* (displaying  $\mu_{01}, \dots, \mu_{0K}$ ), *mu1* (displaying  $\mu_{11}, \dots, \mu_{1K}$ ), *sigma0* (displaying  $\sigma_{01}^2, \dots, \sigma_{0K}^2$ ), *sigma1* (displaying  $\sigma_{11}^2, \dots, \sigma_{1K}^2$ ), *pk0* (displaying  $\lambda_1^{(0)}, \dots, \lambda_K^{(0)}$ ) and *pk1* (displaying  $\lambda_1^{(1)}, \dots, \lambda_K^{(1)}$ ).

**ndisc** Number of iterations for which to discard samples.

**nr** Number of rows in the resulting composite plot.

**nc** Number of columns in the resulting composite plot.

**type** Type of convergence diagnostic. Currently implemented are trace plots (default *type = "trace"*) and ACF plots (*type = "acf"*).

**Examples**

```
#See package vignette
```

---

r.fdr *Significant Hits*

---

**Description**

This function determines significant hits, based on a specified expected FDR.

**Usage**

```
r.fdr(res, fdr=0.05)
```

**Arguments**

**res** An output object from *bhts()*.

**fdr** Expected FDR (default is 0.05).

**Value**

This function returns a list consisting of the following elements:

res	A data frame containing significant hits and their probabilities.
r	The computed significant hit probability threshold.

**Examples**

```
#See package vignette
```

---

sig.k.u	<i>package internal function</i>
---------	----------------------------------

---

**Description**

package internal function

**Usage**

```
sig.k.u(k, ik, z, mu0, a0, b0)
```

**Arguments**

k  
ik  
z  
mu0  
a0  
b0

**Examples**

```
K = 5  
n = 100  
z = abs(rnorm(n))  
mu0 = 0  
ik = sample(K, n, replace=TRUE)  
a0 = 5  
b0 = 5  
sapply(1:K, sig.k.u, ik, z, mu0, a0, b0)
```



---

tau.u *package internal function*

---

**Description**

package internal function

**Usage**

```
tau.u(nu, a0, b0)
```

**Arguments**

nu	Description
a0	Description
b0	Description

**Examples**

```
K = 5
a = 10^-6
b = 10^-6
nu = rbeta(K, a, b)
tau.u(nu, a, b)
```

---

z.pr.u *package internal function*

---

**Description**

package internal function

**Usage**

```
z.pr.u(z, hk, mu, sigma, ph, H, n)
```

**Arguments**

z  
hk  
mu  
sigma  
ph  
H  
n

**Examples**

```
Nmax = 100
K = 5
H = 10
M = 20
n = sample(Nmax, M, replace=TRUE)

z = abs(rnorm(sum(n)))
mu = abs(rnorm(K))
sigma = 1/rgamma(n=K, shape=10, rate=10)

hk = sample(K, M*H, replace=TRUE)

ph = as.vector(sapply(1:M, function(x){lambda.u(rbeta(H, 1, 1))}))

z.pr.u(z, hk, mu, sigma, ph, H, n)
```

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