# Package 'optextras'

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Title Tools to Support Optimization Possibly with Bounds and Masks

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Description Tools to assist in safely applying user generated objective and derivative function to optimization programs. These are primarily function minimization methods with at most bounds and masks on the parameters. Provides a way to check the basic computation of objective functions that the user provides, along with proposed gradient and Hessian functions, as well as to wrap such functions to avoid failures when inadmissible parameters are provided. Check bounds and masks. Check scaling or optimality conditions. Perform an axial search to seek lower points on the objective function surface. Includes forward, central and backward gradient approximation codes.

License GPL-2
Depends numDeriv
Suggests optimx
NeedsCompilation no
Author John C Nash [aut, cre]

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# Description

Provides a replacement and extension of the optim() function to unify and streamline optimization capabilities in R for smooth, possibly box constrained functions of several or many parameters

The three functions ufn, ugr and unless wrap corresponding user functions fn, gr, and hess so that these functions can be executed safely (via try()) and also so parameter or function scaling can be applied. The wrapper functions also allow for maximization of functions (via minimization of the negative of the function) using the logical parameter maximize.

There are three test functions, fnchk, grchk, and hesschk, to allow the user function to be tested for validity and correctness. However, no set of tests is exhaustive, and extensions and improvements are welcome. The package numDeriv is used for generation of numerical approximations to derivatives.

# Details

Package: optextras
Version: 2012-6.18
Date: 2012-06-18
License: GPL-2
Lazyload: Yes
Depends: numDeriv

Suggests: BB, ucminf, Rcgmin, Rvmmin, minqa, setRNG, dfoptim

Repository: R-Forge Repository/R-Forge/Project: optimizer

# Index:

axsearch Perform an axial search optimality check
bmchk Check bounds and masks for parameter constraints
bmstep Compute the maximum step along a search direction.
fnchk Test validity of user function
gHgen Compute gradient and Hessian as a given
set of parameters
gHgenb Compute gradient and Hessian as a given

set of parameters appying bounds and masks

grback Backward numerical gradient approximation

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| grcentral | Central numerical gradient approximation                |
|-----------|---|
| grchk     | Check that gradient function evaluation                 |
|           | matches numerical gradient                              |
| grfwd     | Forward numerical gradient approximation                |
| grnd      | <pre>Gradient approximation using \code{numDeriv}</pre> |
| hesschk   | Check that Hessian function evaluation                  |
|           | matches numerical approximation                         |
| kktchk    | Check the Karush-Kuhn-Tucker optimality conditions      |
| optsp     | An environment to hold some globally useful items       |
|           | used by optimization programs                           |
| scalechk  | Check scale of initial parameters and bounds            |

# Author(s)

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### References

Nash, John C. and Varadhan, Ravi (2011) Unifying Optimization Algorithms to Aid Software System Users: optimx for R, Journal of Statistical Software, publication pending.

### See Also

optim

| axsearch | Perform axial search around a supposed minimum and provide diag- |
|----------|--|
|          | nosiics  |

# **Description**

Nonlinear optimization problems often terminate at points in the parameter space that are not satisfactory optima. This routine conducts an axial search, stepping forward and backward along each parameter and computing the objective function. This allows us to compute the tilt and radius of curvature or roc along that parameter axis.

axsearch assumes that one is MINIMIZING the function fn. While we believe that it will work using the wrapper ufn from this package with the 'maximize=TRUE' setting, we believe it is much safer to write your own function that is to be minimized. That is minimize (-1)\*(function to be maximized). All discussion here is in terms of minimization.

Axial search may find parameters with a function value lower than that at the supposed minimum, i.e., lower than fmin.

In this case axsearch exits immediately with the new function value and parameters. This can be used to restart an optimizer, as in the optimx wrapper.

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### Usage

```
axsearch(par, fn=NULL, fmin=NULL, lower=NULL, upper=NULL, bdmsk=NULL, trace=0, ...)
```

### **Arguments**

par A numeric vector of values of the optimization function parameters that are at a

supposed minimum.

fn The user objective function

fmin The value of the objective function at the parameters par. ?? what if fmin==NULL?

lower A vector of lower bounds on the parameters.

A vector of upper bounds on the parameters.

bdmsk An indicator vector, having 1 for each parameter that is "free" or unconstrained,

and 0 for any parameter that is fixed or MASKED for the duration of the optimization. Partly for historical reasons, we use the same array during the progress of optimization as an indicator that a parameter is at a lower bound (bdmsk ele-

ment set to -3) or upper bound (-1).

trace If trace>0, then local output is enabled.
... Extra arguments for the user function.

#### **Details**

The axial search MAY give a lower function value, in which case, one can restart. Its primary use is in presenting some features of the function surface in the tilt and radius of curvature measures returned. However, better measures should be possible, and this function should be regarded as largely experimental.

# Value

A list with components:

bestfn The lowest (best) function value found (??maximize??) during the axial search,

else the original fmin value. (This is actively set in that case.)

par The vector of parameters at the best function value.

details A data frame reporting the original parameters, the forward step and backward

step function values, the size of the step taken for a particular parameter, the tilt and the roc (radius of curvature). Some elements will be NA if we find a lower

function value during the axial search.

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```
bt.g<-function(x){</pre>
  gg<-2.0*x
}
n<-4
lower<-rep(0,n)</pre>
upper<-lower # to get arrays set
bdmsk<-rep(1,n)
# bdmsk[(trunc(n/2)+1)]<-0</pre>
for (i in 1:n) {
    lower[i] < -1.0*(i-1)*(n-1)/n
    upper[i] < -1.0*i*(n+1)/n
xx<-0.5*(lower+upper)
cat("lower bounds:")
print(lower)
cat("start:
print(xx)
cat("upper bounds:")
print(upper)
cat("Rvmmin \n\n")
# Note: trace set to 0 below. Change as needed to view progress.
abtrvm <- optimr(xx, bt.f, bt.g, lower=lower, upper=upper, method="Rvmmin", control=list(trace=0))
# Note: use lower=lower etc. because there is a missing hess= argument
print(abtrvm)
cat("Axial search")
axabtrvm <- axsearch(abtrvm$par, fn=bt.f, fmin=abtrvm$value, lower, upper, bdmsk=NULL,</pre>
              trace=0)
print(axabtrvm)
cat("Now force an early stop\n")
abtrvm1 <- optimr(xx, bt.f, bt.g, lower=lower, upper=upper, method="Rvmmin",</pre>
                  control=list(maxit=1, trace=0))
print(abtrvm1)
cat("Axial search")
axabtrvm1 <- axsearch(abtrvm1$par, fn=bt.f, fmin=abtrvm1$value, lower, upper, bdmsk=NULL,</pre>
                      trace=0)
print(axabtrvm1)
cat("Maximization test\n")
mabtrvm <- optimr(xx, bt.f, bt.g, lower=lower, upper=upper, method="Rvmmin",</pre>
                 control=list(trace=1, maximize=TRUE))
# Note: use lower=lower etc. because there is a missing hess= argument
print(mabtrvm)
cat("Do NOT try axsearch() with maximize\n")
cat("KKT condition check\n")
akktm <- kktchk(mabtrvm$par, bt.f, bt.g, hess=NULL, upper=upper, lower=lower, maximize=TRUE, control=list(trace
print(akktm)
```

6 bmchk

| bmchk | Check bounds and masks for parameter constraints used in nonlinear optimization |
|-------|---|
|       |   |

# **Description**

Nonlinear optimization problems often have explicit or implicit upper and lower bounds on the parameters of the function to be miminized or maximized. These are called bounds or box constraints. Some of the parameters may be fixed for a given problem or for a temporary trial. These fixed, or masked, parameters are held at one value during a specific 'run' of the optimization.

It is possible that the bounds are inadmissible, that is, that at least one lower bound exceeds an upper bound. In this case we set the flag admissible to FALSE.

Parameters that are outside the bounds are moved to the nearest bound and the flag parchanged is set TRUE. However, we DO NOT change masked parameters, and they may be outside the bounds. This is an implementation choice, since it may be useful to test objective functions at point outside the bounds.

The package bmchk is essentially a test of the R function bmchk(), which is likely to be incorporated within optimization codes.

# Usage

bmchk(par, lower=NULL, upper=NULL, bdmsk=NULL, trace=0, tol=NULL, shift2bound=TRUE)

# Arguments

| par         | A numeric vector of starting values of the optimization function parameters.   |
|-------------|--|
| lower       | A vector of lower bounds on the parameters.  |
| upper       | A vector of upper bounds on the parameters.  |
| bdmsk       | An indicator vector, having 1 for each parameter that is "free" or unconstrained, and 0 for any parameter that is fixed or MASKED for the duration of the optimization. Partly for historical reasons, we use the same array during the progress of optimization as an indicator that a parameter is at a lower bound (bdmsk element set to -3) or upper bound (-1). |
| trace       | An integer that controls whether diagnostic information is displayed. A positive value displays information, 0 (default) does not.   |
| tol         | If provided, is used to detect a MASK, that is, lower=upper for some parameter.  |
| shift2bound | If TRUE, non-masked paramters outside bounds are adjusted to the nearest bound. We then set parchanged = TRUE which implies the original parameters were infeasible.   |

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### **Details**

The bmchk function will check that the bounds exist and are admissible, that is, that there are no lower bounds that exceed upper bounds.

There is a check if lower and upper bounds are very close together, in which case a mask is imposed and maskadded is set TRUE. NOTE: it is generally a VERY BAD IDEA to have bounds close together in optimization, but here we use a tolerance based on the double precision machine epsilon. Thus it is not a good idea to rely on bmchk() to test if bounds constraints are well-posed.

### Value

A list with components:

byec The vector of parameters, possibly adjusted for bounds. Parameters outside

bounds are adjusted to the nearest bound.

bdmsk adjusted input masks

bchar indicator for humans – "-","L","F","U","+","M" for out-of-bounds-low, lower

bound, free, upper bound, out-of-bounds-high, masked (fixed)

lower (adjusted) lower bounds. If upper-lower<tol, we create a mask rather than leave

bounds. In this case we could eliminate the bounds. At the moment, this change is NOT made, but a commented line of code is present in the file bmchk.R.

upper (adjusted) upper bounds

nolower TRUE if no lower bounds, FALSE otherwise
noupper TRUE if no upper bounds, FALSE otherwise
bounds TRUE if there are any bounds, FALSE otherwise

admissible TRUE if bounds are admissible, FALSE otherwise This means no lower bound

exceeds an upper bound. That is the bounds themselves are sensible. This con-

dition has nothing to do with the starting parameters.

maskadded TRUE when a mask has been added because bounds are very close or equal,

FALSE otherwise. See the code for the implementation.

parchanged TRUE if parameters are changed by bounds, FALSE otherswise. Note that

parchanged = TRUE implies the input parameter values were infeasible, that

is, violated the bounds constraints.

feasible TRUE if parameters are within or on bounds, FALSE otherswise.

onbound TRUE if any parameter is on a bound, FALSE otherswise. Note that parchanged

= TRUE implies onbound = TRUE, but this is not used inside the function. This output value may be important, for example, in using the optimization function

nmkb from package dfoptim.

# **Examples**

# ######################

```
cat("25-dimensional box constrained function\n") flb <- function(x) { p <- length(x); sum(c(1, rep(4, p-1)) * (x - c(1, x[-p])^2)^2) }
```

8 bmstep

```
start<-rep(2, 25)
cat("\n start:")
print(start)
lo<-rep(2,25)
cat("\n lo:")
print(lo)
hi<-rep(4,25)
cat("\n hi:")
print(hi)
bt<-bmchk(start, lower=lo, upper=hi, trace=1)
print(bt)</pre>
```

bmstep

Compute the maximum step along a search direction.

### **Description**

Nonlinear optimization problems often have explicit or implicit upper and lower bounds on the parameters of the function to be miminized or maximized. These are called bounds or box constraints. Some of the parameters may be fixed for a given problem or for a temporary trial. These fixed, or masked, parameters are held at one value during a specific 'run' of the optimization.

The bmstep() function computes the maximum step possible (which could be infinite) along a particular search direction from current parameters to bounds.

# Usage

```
bmstep(par, srchdirn, lower=NULL, upper=NULL, bdmsk=NULL, trace=0)
```

# Arguments

par A numeric vector of starting values of the optimization function parameters.

srchdirn A numeric vector giving the search direction.

lower A vector of lower bounds on the parameters.

upper A vector of upper bounds on the parameters.

bdmsk An indicator vector, having 1 for each parameter that is "free" or unconstrained,

and 0 for any parameter that is fixed or MASKED for the duration of the optimization. Partly for historical reasons, we use the same array during the progress of optimization as an indicator that a parameter is at a lower bound (bdmsk ele-

ment set to -3) or upper bound (-1).

trace An integer that controls whether diagnostic information is displayed. A positive

value displays information, 0 (default) does not.

# **Details**

The bmstep function will compute and return (as a double or Inf) the maximum step to the bounds.

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# Value

A double precision value or Inf giving the maximum step to the bounds.

# **Examples**

```
#########################

xx <- c(1, 1)
lo <- c(0, 0)
up <- c(100, 40)
sdir <- c(4,1)
bm <- c(1,1) # both free
ans <- bmstep(xx, sdir, lo, up, bm, trace=1)
# stepsize
print(ans)
# distance
print(ans*sdir)
# New parameters
print(xx+ans*sdir)</pre>
```

fnchk

Run tests, where possible, on user objective function

# Description

fnchk checks a user-provided R function, ffn.

# Usage

```
fnchk(xpar, ffn, trace=0, ...)
```

# **Arguments**

| xpar  | the (double) vector of parameters to the objective funcion      |
|-------|---|
| ffn   | a user-provided function to compute the objective function      |
| trace | set >0 to provide output from fnchk to the console, 0 otherwise |
|       | optional arguments passed to the objective function.            |

# **Details**

fnchk attempts to discover various errors in function setup in user-supplied functions primarily intended for use in optimization calculations. There are always more conditions that could be tested!

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### Value

msg

The output is a list consisting of list(fval=fval, infeasible=infeasible, excode=excode, msg=msg)

fval The calculated value of the function at parameters xpar if the function can be

evaluated.

infeasible FALSE if the function can be evaluated, TRUE if not.

excode An exit code, which has a relationship to

A text string giving information about the result of the function check: Messages and the corresponding values of excode are:

- fnchk OK; excode = 0; infeasible = FALSE
- Function returns INADMISSIBLE; excode = -1; infeasible = TRUE
- Function returns a vector not a scalar; excode = -4; infeasible = TRUE
- Function returns a list not a scalar; excode = -4; infeasible = TRUE
- Function returns a matrix list not a scalar; excode = -4; infeasible = TRUE
- Function returns an array not a scalar; excode = -4; infeasible = TRUE
- Function returned not length 1, despite not vector, matrix or array; excode = -4; infeasible = TRUE
- Function returned non-numeric value; excode = 0; excode = -1; infeasible = TRUE
- Function returned Inf or NA (non-computable); excode = -1; infeasible = TRUE

# Author(s)

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```
# Want to illustrate each case.
# Ben Bolker idea for a function that is NOT scalar
benbad<-function(x, y){
    # y may be provided with different structures
    f<-(x-y)^2
} # very simple, but ...

y<-1:10
x<-c(1)
cat("test benbad() with y=1:10, x=c(1)\n")
fc01<-fnchk(x, benbad, trace=1, y)
print(fc01)

y<-as.vector(y)
cat("test benbad() with y=as.vector(1:10), x=c(1)\n")
fc02<-fnchk(x, benbad, trace=1, y)
print(fc02)</pre>
```

```
y<-as.matrix(y)</pre>
cat("test benbad() with y=as.matrix(1:10), x=c(1)\n")
fc03<-fnchk(x, benbad, trace=1, y)</pre>
print(fc03)
y<-as.array(y)
cat("test benbad() with y=as.array(1:10), x=c(1) n")
fc04<-fnchk(x, benbad, trace=1, y)</pre>
print(fc04)
y<-"This is a string"
cat("test benbad() with y a string, x=c(1)\n")
fc05<-fnchk(x, benbad, trace=1, y)</pre>
print(fc05)
fr <- function(x) { ## Rosenbrock Banana function</pre>
    x1 <- x[1]
    x2 <- x[2]
    100 * (x2 - x1 * x1)^2 + (1 - x1)^2
}
xtrad < -c(-1.2,1)
ros1<-fnchk(xtrad, fr, trace=1)</pre>
print(ros1)
npar<-2
opros<-list2env(list(fn=fr, gr=NULL, hess=NULL, MAXIMIZE=FALSE, PARSCALE=rep(1,npar), FNSCALE=1,
       KFN=0, KGR=0, KHESS=0, dots=NULL))
uros1<-fnchk(xtrad, ufn, trace=1, fnuser=opros)
print(uros1)
require(optextras)
# require(optimx)
cat("Show how fnchk works\n")
```

gHgen

Generate gradient and Hessian for a function at given parameters.

# Description

gHgen is used to generate the gradient and Hessian of an objective function used for optimization. If a user-provided gradient function gr is available it is used to compute the gradient, otherwise package numDeriv is used. If a user-provided Hessian function hess is available, it is used to compute a Hessian. Otherwise, if gr is available, we use the function jacobian() from package numDeriv to compute the Hessian. In both these cases we check for symmetry of the Hessian. Computational Hessians are commonly NOT symmetric. If only the objective function fn is provided, then the Hessian is approximated with the function hessian from package numDeriv which guarantees a symmetric matrix.

#### Usage

### **Arguments**

Set of parameters, assumed to be at a minimum of the function fn. par Name of the objective function. fn (Optional) function to compute the gradient of the objective function. If present, gr we use the Jacobian of the gradient as the Hessian and avoid one layer of numerical approximation to the Hessian. hess (Optional) function to compute the Hessian of the objective function. This is rarely available, but is included for completeness. control A list of controls to the function. Currently asymptol (default of 1.0e-7 which tests for asymmetry of Hessian approximation (see code for details of the test); ktrace, a logical flag which, if TRUE, monitors the progress of gHgen (default FALSE), and stoponerror, defaulting to FALSE to NOT stop when there is an

error or asymmetry of Hessian. Set TRUE to stop.

Extra data needed to compute the function, gradient and Hessian.

### **Details**

None

### Value

ansout a list of four items,

- gn The approximation to the gradient vector.
- Hn The approximation to the Hessian matrix.
- gradOK TRUE if the gradient has been computed acceptably. FALSE otherwise.
- hessok TRUE if the gradient has been computed acceptably and passes the symmetry test.
   FALSE otherwise.
- nbm Always 0. The number of active bounds and masks. Present to make function consistent with gHgenb.

```
gg <- as.vector(rep(0, n))</pre>
tn <- 2:n
tn1 <- tn - 1
z1 <- x[tn] - x[tn1]^2
z2 <- 1 - x[tn]
gg[tn] \leftarrow 2 * (gs * z1 - z2)
gg[tn1] \leftarrow gg[tn1] - 4 * gs * x[tn1] * z1
return(gg)
}
genrose.h <- function(x, gs=NULL) { \#\# compute Hessian
   if(is.null(gs)) { gs=100.0 }
n <- length(x)</pre>
hh < -matrix(rep(0, n*n), n, n)
for (i in 2:n) {
z1 < -x[i] - x[i-1] * x[i-1]
# z2<-1.0-x[i]
                 hh[i,i] < -hh[i,i] + 2.0*(gs+1.0)
                 hh[i-1,i-1] < -hh[i-1,i-1] - 4.0*gs*z1-4.0*gs*x[i-1]*(-2.0*x[i-1])
                 hh[i,i-1] < -hh[i,i-1] - 4.0 * gs * x[i-1]
                 hh[i-1,i] < -hh[i-1,i] - 4.0 * gs * x[i-1]
}
        return(hh)
}
trad < -c(-1.2,1)
ans100fgh<- gHgen(trad, genrose.f, gr=genrose.g, hess=genrose.h,
      control=list(ktrace=1))
print(ans100fgh)
ans100fg<- gHgen(trad, genrose.f, gr=genrose.g,</pre>
      control=list(ktrace=1))
print(ans100fg)
ans100f<- gHgen(trad, genrose.f, control=list(ktrace=1))</pre>
print(ans100f)
              gHgen(trad, genrose.f, gr=genrose.g, hess=genrose.h,
ans10fgh<-
      control=list(ktrace=1), gs=10)
print(ans10fgh)
             gHgen(trad, genrose.f, gr=genrose.g,
ans10fg<-
      control=list(ktrace=1), gs=10)
print(ans10fg)
           gHgen(trad, genrose.f, control=list(ktrace=1), gs=10)
ans10f<-
print(ans10f)
```

gHgenb

Generate gradient and Hessian for a function at given parameters.

# **Description**

gHgenb is used to generate the gradient and Hessian of an objective function used for optimization. If a user-provided gradient function gr is available it is used to compute the gradient, otherwise

package numDeriv is used. If a user-provided Hessian function hess is available, it is used to compute a Hessian. Otherwise, if gr is available, we use the function jacobian() from package numDeriv to compute the Hessian. In both these cases we check for symmetry of the Hessian. Computational Hessians are commonly NOT symmetric. If only the objective function fn is provided, then the Hessian is approximated with the function hessian from package numDeriv which guarantees a symmetric matrix.

# Usage

```
gHgenb(par, fn, gr=NULL, hess=NULL, bdmsk=NULL, lower=NULL, upper=NULL,
     control=list(ktrace=0), ...)
```

### **Arguments**

par Set of parameters, assumed to be at a minimum of the function fn.

fn Name of the objective function.

gr (Optional) function to compute the gradient of the objective function. If present,

we use the Jacobian of the gradient as the Hessian and avoid one layer of nu-

merical approximation to the Hessian.

hess (Optional) function to compute the Hessian of the objective function. This is

rarely available, but is included for completeness.

bdmsk An integer vector of the same length as par. When an element of this vector is

0, the corresponding parameter value is fixed (masked) during an optimization. Non-zero values indicate a parameter is free (1), at a lower bound (-3) or at an

upper bound (-1), but this routine only uses 0 values.

lower Lower bounds for parameters in par.
upper Upper bounds for parameters in par.

control A list of controls to the function. Currently asymptol (default of 1.0e-7 which

tests for asymmetry of Hessian approximation (see code for details of the test); ktrace, a logical flag which, if TRUE, monitors the progress of gHgenb (default FALSE), and stoponerror, defaulting to FALSE to NOT stop when there is an

error or asymmetry of Hessian. Set TRUE to stop.

... Extra data needed to compute the function, gradient and Hessian.

### **Details**

None

#### Value

ansout a list of four items.

- gn The approximation to the gradient vector.
- Hn The approximation to the Hessian matrix.
- gradOK TRUE if the gradient has been computed acceptably. FALSE otherwise.
- hessok TRUE if the gradient has been computed acceptably and passes the symmetry test.
   FALSE otherwise.
- nbm The number of active bounds and masks.

```
# genrose function code
genrose.f<- function(x, gs=NULL){ # objective function</pre>
## One generalization of the Rosenbrock banana valley function (n parameters)
n <- length(x)</pre>
         if(is.null(gs)) { gs=100.0 }
fval < -1.0 + sum (gs*(x[1:(n-1)]^2 - x[2:n])^2 + (x[2:n] - 1)^2)
         return(fval)
}
genrose.g <- function(x, gs=NULL){</pre>
# vectorized gradient for genrose.f
# Ravi Varadhan 2009-04-03
n \leftarrow length(x)
         if(is.null(gs)) { gs=100.0 }
gg <- as.vector(rep(0, n))</pre>
tn <- 2:n
tn1 <- tn - 1
z1 <- x[tn] - x[tn1]^2
z2 <- 1 - x[tn]
gg[tn] \leftarrow 2 * (gs * z1 - z2)
gg[tn1] \leftarrow gg[tn1] - 4 * gs * x[tn1] * z1
return(gg)
genrose.h <- function(x, gs=NULL) { ## compute Hessian</pre>
   if(is.null(gs)) { gs=100.0 }
n <- length(x)</pre>
hh<-matrix(rep(0, n*n),n,n)</pre>
for (i in 2:n) {
z1 < -x[i] - x[i-1] * x[i-1]
z2 < -1.0 - x[i]
                  hh[i,i] < -hh[i,i] + 2.0*(gs+1.0)
                  hh[i-1,i-1] < -hh[i-1,i-1] - 4.0 + gs + z1 - 4.0 + gs + x[i-1] + (-2.0 + x[i-1])
                  hh[i,i-1] < -hh[i,i-1] - 4.0 * gs * x[i-1]
                  hh[i-1,i] < -hh[i-1,i] - 4.0 * gs * x[i-1]
}
         return(hh)
}
maxfn<-function(x, top=10) {</pre>
        n<-length(x)</pre>
ss < -seq(1,n)
f<-top-(crossprod(x-ss))^2
f<-as.numeric(f)</pre>
return(f)
}
negmaxfn<-function(x) {</pre>
f < -(-1) * maxfn(x)
return(f)
```

```
}
parx<-rep(1,4)
lower < -rep(-10,4)
upper<-rep(10,4)
bdmsk<-c(1,1,0,1) # masked parameter 3
fval<-genrose.f(parx)</pre>
gval<-genrose.g(parx)</pre>
Ahess<-genrose.h(parx)
gennog<-gHgenb(parx,genrose.f)</pre>
cat("results of gHgenb for genrose without gradient code at ")
print(parx)
print(gennog)
cat("compare to g =")
print(gval)
cat("and Hess\n")
print(Ahess)
cat("\n\n")
geng<-gHgenb(parx,genrose.f,genrose.g)</pre>
cat("results of gHgenb for genrose at ")
print(parx)
print(gennog)
cat("compare to g =")
print(gval)
cat("and Hess\n")
print(Ahess)
parx<-rep(0.9,4)
fval<-genrose.f(parx)</pre>
gval<-genrose.g(parx)</pre>
Ahess<-genrose.h(parx)
gennog<-gHgenb(parx,genrose.f,control=list(ktrace=TRUE), gs=9.4)</pre>
cat("results of gHgenb with gs=",9.4," for genrose without gradient code at ")
print(parx)
print(gennog)
cat("compare to g =")
print(gval)
cat("and Hess\n")
print(Ahess)
cat("\n\n")
geng<-gHgenb(parx,genrose.f,genrose.g, control=list(ktrace=TRUE))</pre>
cat("results of gHgenb for genrose at ")
print(parx)
print(gennog)
cat("compare to g =")
print(gval)
cat("and Hess\n")
print(Ahess)
gst<-5
cat("\n full calling sequence and gs=",gst,"\n")
gengall<-gHgenb(parx,genrose.f,genrose.g,genrose.h, control=list(ktrace=TRUE),gs=gst)</pre>
print(gengall)
```

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```
top<-25
x0<-rep(2,4)
cat("\n\nTest for maximization and top=",top,"\n")
cat("Gradient and Hessian will have sign inverted")
maxt<-gHgen(x0, maxfn, control=list(ktrace=TRUE), top=top)
print(maxt)

cat("test against negmaxfn\n")
gneg<-grad(negmaxfn, x0)
Hneg<-hessian(negmaxfn, x0)
# gdiff<-max(abs(gneg-maxt$gn))/max(abs(maxt$gn))
# Hdiff<-max(abs(Hneg-maxt$Hn))/max(abs(maxt$Hn))
# explicitly change sign
gdiff<-max(abs(gneg-(-1)*maxt$gn))/max(abs(maxt$gn))
Hdiff<-max(abs(Hneg-(-1)*maxt$Hn))/max(abs(maxt$Hn))
cat("gdiff = ",gdiff," Hdiff=",Hdiff,"\n")</pre>
```

grback

Backward difference numerical gradient approximation.

# **Description**

grback computes the backward difference approximation to the gradient of user function userfn.

# Usage

```
grback(par, userfn, fbase=NULL, env=optsp, ...)
```

# **Arguments**

| par    | parameters to the user objective function userfn  |
|--------|---|
| userfn | User-supplied objective function  |
| fbase  | The value of the function at the parameters, else NULL. This is to save recomputing the function at this point. |
| env    | Environment for scratchpad items (like deps for approximation control in this routine). Default optsp.          |
|        | optional arguments passed to the objective function.  |

### **Details**

Package: grback
Depends: R (>= 2.6.1)
License: GPL Version 2.

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### Value

grback returns a single vector object df which approximates the gradient of userfn at the parameters par. The approximation is controlled by a global value optderiveps that is set when the package is attached.

# Author(s)

John C. Nash

# **Examples**

```
cat("Example of use of grback\n")
myfn < -function(xx, shift=100){
    ii<-1:length(xx)
    result<-shift+sum(xx^ii)</pre>
}
xx<-c(1,2,3,4)
ii<-1:length(xx)
print(xx)
gn<-grback(xx,myfn, shift=0)</pre>
print(gn)
ga<-ii*xx^(ii-1)
cat("compare to analytic gradient:\n")
print(ga)
cat("change the step parameter to 1e-4\n")
optsp$deps <- 1e-4
gn2<-grback(xx,myfn, shift=0)</pre>
print(gn2)
```

grcentral

Central difference numerical gradient approximation.

# **Description**

grcentral computes the central difference approximation to the gradient of user function userfn.

# Usage

```
grcentral(par, userfn, fbase=NULL, env=optsp, ...)
```

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# Arguments

env

par parameters to the user objective function userfn
userfn
User-supplied objective function

The value of the function at the parameters, else NULL. This is to save recomputing the function at this point.

Environment for scratchpad items (like deps for approximation control in this

routine). Default optsp.

... optional arguments passed to the objective function.

### **Details**

Package: grcentral
Depends: R (>= 2.6.1)
License: GPL Version 2.

### Value

grcentral returns a single vector object df which approximates the gradient of userfn at the parameters par. The approximation is controlled by a global value optderiveps that is set when the package is attached.

# Author(s)

John C. Nash

```
cat("Example of use of grcentral\n")
myfn<-function(xx, shift=100){
    ii<-1:length(xx)
    result<-shift+sum(xx^ii)
}
xx<-c(1,2,3,4)
ii<-1:length(xx)
print(xx)
gn<-grcentral(xx,myfn, shift=0)
print(gn)
ga<-ii*xx^(ii-1)
cat("compare to\n")
print(ga)</pre>
```

20 grchk

| grchk Run tests, where possible, on user objective function and (optionally) gradient and hessian | grchk | Run tests, where possible, on user objective function and (optionally) gradient and hessian |
|---|-------|---|
|---|-------|---|

# Description

grchk checks a user-provided R function, ffn.

# Usage

```
grchk(xpar, ffn, ggr, trace=0, testtol=(.Machine$double.eps)^(1/3), ...)
```

# **Arguments**

| xpar    | parameters to the user objective and gradient functions ffn and ggr |
|---------|---|
| ffn     | User-supplied objective function                                    |
| ggr     | User-supplied gradient function                                     |
| trace   | set >0 to provide output from grchk to the console, 0 otherwise     |
| testtol | tolerance for equality tests  |
|         | optional arguments passed to the objective function.                |

### **Details**

Package: grchk
Depends: R (>= 2.6.1)
License: GPL Version 2.

numDeriv is used to numerically approximate the gradient of function ffn and compare this to the result of function ggr.

### Value

grchk returns a single object gradOK which is true if the differences between analytic and approximated gradient are small as measured by the tolerance testtol.

This has attributes "ga" and "gn" for the analytic and numerically approximated gradients.

At the time of preparation, there are no checks for validity of the gradient code in ggr as in the function fnchk.

# Author(s)

John C. Nash

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# **Examples**

```
# Would like examples of success and failure. What about "near misses"??
cat("Show how grchk works\n")
require(optextras)
require(numDeriv)
# require(optimx)
jones<-function(xx){</pre>
  x<-xx[1]
  y < -xx[2]
  ff < -\sin(x + x/2 - y + y/4) + \cos(2 + x - \exp(y))
  ff<- -ff
}
jonesg <- function(xx) {</pre>
  x<-xx[1]
  v<-xxΓ21
  gx \leftarrow cos(x * x/2 - y * y/4) * ((x + x)/2) * cos(2 * x - exp(y)) -
    \sin(x * x/2 - y * y/4) * (\sin(2 * x - \exp(y)) * 2)
  gy < -\sin(x * x/2 - y * y/4) * (\sin(2 * x - \exp(y)) * \exp(y)) - \cos(x * y/4)
                                                                x/2 - y * y/4) * ((y + y)/4) * cos(2 * x - exp(y))
  gg \leftarrow -c(gx, gy)
jonesg2 <- function(xx) {</pre>
  gx <- 1
  gy <- 2
  gg \leftarrow -c(gx, gy)
xx < -c(1, 2)
gcans <- grchk(xx, jones, jonesg, trace=1, testtol=(.Machine$double.eps)^(1/3))</pre>
gcans
gcans2 <- grchk(xx, jones, jonesg2, trace=1, testtol=(.Machine$double.eps)^(1/3))</pre>
gcans2
```

grfwd

Forward difference numerical gradient approximation.

# Description

grfwd computes the forward difference approximation to the gradient of user function userfn.

22 grfwd

# Usage

```
grfwd(par, userfn, fbase=NULL, env=optsp, ...)
```

# **Arguments**

par parameters to the user objective function userfn userfn User-supplied objective function fbase The value of the function at the parameters, else NULL. This is to save recomputing the function at this point.

env Environment for scratchpad items (like deps for approximation control in this

routine). Default optsp.

optional arguments passed to the objective function.

### **Details**

grfwd Package: Depends: R (>= 2.6.1)License: GPL Version 2.

# Value

gr fwd returns a single vector object df which approximates the gradient of userfn at the parameters par. The approximation is controlled by a global value optderiveps that is set when the package is attached.

# Author(s)

John C. Nash

```
cat("Example of use of grfwd\n")
myfn<-function(xx, shift=100){</pre>
    ii<-1:length(xx)
    result<-shift+sum(xx^ii)</pre>
xx<-c(1,2,3,4)
ii<-1:length(xx)
print(xx)
gn<-grfwd(xx,myfn, shift=0)</pre>
print(gn)
ga<-ii*xx^(ii-1)
cat("compare to\n")
print(ga)
```

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grnd

A reorganization of the call to numDeriv grad() function.

# **Description**

Provides a wrapper for the numDeriv approximation to the gradient of a user supplied objective function userfn.

# Usage

```
grnd(par, userfn, ...)
```

# **Arguments**

par A vector of parameters to the user-supplied function fn
userfn A user-supplied function

Other data needed to evaluate the user function.

# **Details**

The Richardson method is used in this routine.

# Value

grnd returns an approximation to the gradient of the function userfn

```
cat("Example of use of grnd\n")
require(numDeriv)
myfn<-function(xx, shift=100){
    ii<-1:length(xx)
        result<-shift+sum(xx^ii)
}
xx<-c(1,2,3,4)
ii<-1:length(xx)
print(xx)
gn<-grnd(xx,myfn, shift=0)
print(gn)
ga<-ii*xx^(ii-1)
cat("compare to\n")
print(ga)</pre>
```

24 hesschk

| hesschk | Run tests, where possible, on user objective function and (optionally) gradient and hessian |
|---------|---|
|         |   |

# **Description**

hesschk checks a user-provided R function, ffn.

# Usage

```
hesschk(xpar, ffn, ggr, hhess, trace=0, testtol=(.Machine$double.eps)^(1/3), ...)
```

# **Arguments**

| xpar    | parameters to the user objective and gradient functions ffn and ggr |
|---------|---|
| ffn     | User-supplied objective function                                    |
| ggr     | User-supplied gradient function                                     |
| hhess   | User-supplied Hessian function                                      |
| trace   | set >0 to provide output from grchk to the console, 0 otherwise     |
| testtol | tolerance for equality tests  |
| • • •   | optional arguments passed to the objective function.                |

### **Details**

Package: hesschk
Depends: R (>= 2.6.1)
License: GPL Version 2.

numDeriv is used to compute a numerical approximation to the Hessian matrix. If there is no analytic gradient, then the hessian() function from numDeriv is applied to the user function ffn. Otherwise, the jacobian() function of numDeriv is applied to the ggr function so that only one level of differencing is used.

# Value

The function returns a single object hessOK which is TRUE if the analytic Hessian code returns a Hessian matrix that is "close" to the numerical approximation obtained via numDeriv; FALSE otherwise.

hessOK is returned with the following attributes:

- "nullhess"Set TRUE if the user does not supply a function to compute the Hessian.
- "asym"Set TRUE if the Hessian does not satisfy symmetry conditions to within a tolerance. See the hesschk for details.

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- "ha"The analytic Hessian computed at paramters xpar using hhess.
- "hn"The numerical approximation to the Hessian computed at paramters xpar.
- "msg"A text comment on the outcome of the tests.

# Author(s)

John C. Nash

```
# genrose function code
genrose.f<- function(x, gs=NULL){ # objective function</pre>
## One generalization of the Rosenbrock banana valley function (n parameters)
n \leftarrow length(x)
        if(is.null(gs)) { gs=100.0 }
fval<-1.0 + sum (gs*(x[1:(n-1)]^2 - x[2:n])^2 + (x[2:n] - 1)^2)
        return(fval)
}
genrose.g <- function(x, gs=NULL){</pre>
# vectorized gradient for genrose.f
# Ravi Varadhan 2009-04-03
n \leftarrow length(x)
        if(is.null(gs)) { gs=100.0 }
gg <- as.vector(rep(0, n))</pre>
tn <- 2:n
tn1 <- tn - 1
z1 <- x[tn] - x[tn1]^2
z2 <- 1 - x[tn]
gg[tn] \leftarrow 2 * (gs * z1 - z2)
gg[tn1] \leftarrow gg[tn1] - 4 * gs * x[tn1] * z1
return(gg)
genrose.h <- function(x, gs=NULL) { ## compute Hessian</pre>
   if(is.null(gs)) { gs=100.0 }
n \leftarrow length(x)
hh < -matrix(rep(0, n*n), n, n)
for (i in 2:n) {
z1 < -x[i] - x[i-1] * x[i-1]
# z2<-1.0-x[i]
                 hh[i,i] < -hh[i,i] + 2.0*(gs+1.0)
                 hh[i-1,i-1] < -hh[i-1,i-1] - 4.0*gs*z1-4.0*gs*x[i-1]*(-2.0*x[i-1])
                 hh[i,i-1]<-hh[i,i-1]-4.0*gs*x[i-1]
                 hh[i-1,i] < -hh[i-1,i] - 4.0 * gs * x[i-1]
}
        return(hh)
}
trad < -c(-1.2,1)
ans100<-hesschk(trad, genrose.f, genrose.g, genrose.h, trace=1)</pre>
print(ans100)
```

26 kktchk

```
ans10<-hesschk(trad, genrose.f, genrose.g, genrose.h, trace=1, gs=10) print(ans10) \,
```

| kktchk | Check Kuhn Karush Tucker conditions for a supposed function mini- |
|--------|---|
|        | mum   |

# Description

Provide a check on Kuhn-Karush-Tucker conditions based on quantities already computed. Some of these used only for reporting.

# Usage

```
kktchk(par, fn, gr, hess=NULL, upper=NULL, lower=NULL, maximize=FALSE, control=list(), ...)
```

# Arguments

| par      | A vector of values for the parameters which are supposedly optimal.           |
|----------|---|
| fn       | The objective function  |
| gr       | The gradient function   |
| hess     | The Hessian function  |
| upper    | Upper bounds on the parameters  |
| lower    | Lower bounds on the parameters  |
| maximize | Logical TRUE if function is being maximized. Default FALSE.                   |
| control  | A list of controls for the function   |
|          | The dot arguments needed for evaluating the function and gradient and hessian |

### **Details**

kktchk computes the gradient and Hessian measures for BOTH unconstrained and bounds (and masks) constrained parameters, but the kkt measures are evaluated only for the constrained case.

# Value

The output is a list consisting of

| gmax    | The absolute value of the largest gradient component in magnitude.   |  |
|---------|--|--|
| evratio | The ratio of the smallest to largest Hessian eigenvalue. Note that this may be negative.   |  |
| kkt1    | A logical value that is TRUE if we consider the first (i.e., gradient) KKT condition to be satisfied. WARNING: The decision is dependent on tolerances and |  |

scaling that may be inappropriate for some problems.

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A logical value that is TRUE if we consider the second (i.e., positive definite Hessian) KKT condition to be satisfied. WARNING: The decision is dependent on tolerances and scaling that may be inappropriate for some problems.

hev The calculated hessian eigenvalues, sorted largest to smallest??

ngatend The computed (unconstrained) gradient at the solution parameters.

nnatend The computed (unconstrained) hessian at the solution parameters.

# See Also

optim

```
cat("Show how kktc works\n")
require(optimx)
require(optextras)
jones<-function(xx){</pre>
   x<-xx[1]
   y<-xx[2]
   ff < -\sin(x*x/2 - y*y/4)*\cos(2*x-\exp(y))
   ff<- -ff
}
jonesg <- function(xx) {</pre>
   x<-xx[1]
   y < -xx[2]
   gx \leftarrow cos(x * x/2 - y * y/4) * ((x + x)/2) * cos(2 * x - exp(y)) -
         \sin(x * x/2 - y * y/4) * (\sin(2 * x - \exp(y)) * 2)
   gy < -\sin(x * x/2 - y * y/4) * (\sin(2 * x - \exp(y)) * \exp(y)) - \cos(x * y/4)
           x/2 - y * y/4) * ((y + y)/4) * cos(2 * x - exp(y))
   gg \leftarrow - c(gx, gy)
}
xx<-0.5*c(pi,pi)
ans <- optimr(xx, jones, jonesg, method="Rvmmin")</pre>
kkans <- kktchk(ans$par, jones, jonesg)</pre>
kkans
```

28 scalechk

| scalechk | Check the scale of the initial parameters and bounds input to an optimization code used in nonlinear optimization |
|----------|---|
|          |   |

# **Description**

Nonlinear optimization problems often have different scale for different parameters. This function is intended to explore the differences in scale. It is, however, an imperfect and heuristic tool, and could be improved.

At this time scalechk does NOT take account of masks. (?? should 110702)

# Usage

```
scalechk(par, lower = lower, upper = upper, bdmsk=NULL, dowarn = TRUE)
```

# **Arguments**

| par   | A numeric vector of starting values of the optimization function parameters.  |
|-------|---|
| lower | A vector of lower bounds on the parameters.   |
| upper | A vector of upper bounds on the parameters.   |
| bdmsk | An indicator vector, having 1 for each parameter that is "free" or unconstrained, and 0 for any parameter that is fixed or MASKED for the duration of the optimization. |

Set TRUE to issue warnings. Othwerwise this is a silent routine. Default TRUE.

### **Details**

dowarn

The scalechk function will check that the bounds exist and are admissible, that is, that there are no lower bounds that exceed upper bounds.

NOTE: Free paramters outside bounds are adjusted to the nearest bound. We then set parchanged = TRUE which implies the original parameters were infeasible.

There is a check if lower and upper bounds are very close together, in which case a mask is imposed and maskadded is set TRUE. NOTE: it is generally a VERY BAD IDEA to have bounds close together in optimization, but here we use a tolerance based on the double precision machine epsilon. Thus it is not a good idea to rely on scalechk() to test if bounds constraints are well-posed.

# Value

A list with components:

# Returns: # list(lpratio, lbratio) – the log of the ratio of largest to smallest parameters # and bounds intervals (upper-lower) in absolute value (ignoring Inf, NULL, NA)

| lpratio  | The log of the ratio of largest to smallest parameters in absolute value (ignoring Inf, NULL, NA)                     |
|----------|---|
| lbration | The log of the ratio of largest to smallest bounds intervals (upper-lower) in absolute value (ignoring Inf, NULL, NA) |

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```
###############################

par <- c(-1.2, 1)
lower <- c(-2, 0)
upper <- c(100000, 10)
srat<-scalechk(par, lower, upper,dowarn=TRUE)
print(srat)
sratv<-c(srat$lpratio, srat$lbratio)
if (max(sratv,na.rm=TRUE) > 3) { # scaletol from ctrldefault in optimx
    warnstr<-"Parameters or bounds appear to have different scalings.\n This can cause poor performance in optim
    cat(warnstr,"\n")
}</pre>
```

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