Understanding nlsModel in the base R nls() function

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Objective

The R function nls() for nonlinear least squares modeling uses a structure where a "model" object named m is built from an expression in the nls call. This object contains a great deal of functionality in the form of data and functions that different parts of the nls infrastructure can use. In particular, m contains functions to determine if the estimation of the model is "converged" (actually if the process is "terminated") as well as computations of residuals and the search direction for the next set of parameters.

This article is an attempt to document and test the features of the nlsModel object m.

ISSUES

- Why is there only upper in the arguments of nlsModel(), i.e., no lower? For the default algorithm, upper makes no sense either.
- Why do we have no Varying versions of some functions? And with so many attributes? But also the function set Varying? Is this possibly a way to specify the parameters that are "free" in the Nash and Walker-Smith sense of bounds and masks?
- Where is the QR decomposition actually executed? This is key to establishing the Gauss-Newton iteration.

Location of the nlsModel code

The code is found in the file ./R-devel/src/library/stats/R/nls.R

Note that there is a version nlsModel.plinear for use with partially linear models (?? a ref would be helpful here). The default case and the use of bounds constraints using the algorithm setting "port" are handled by nlsModel.

Here we will at time of writing (June 2021) only deal with the default case.

Generating an 'm'' object

Let us use the Croucher problem and/or the Hobbs weed infestation problem (Nash (1979), page 120) again.

```
# Croucher-example1.R -- https://walkingrandomly.com/?p=5254 # construct the data vectors using c() xdata = c(-2,-1.64,-1.33,-0.7,0,0.45,1.2,1.64,2.32,2.9) ydata = c(0.699369,0.700462,0.695354,1.03905,1.97389,2.41143,1.91091,0.919576,-0.730975,-1.42001)
```

```
# some starting values
p1 = 1
p2 = 0.2
Cdata <- data .frame (xdata, ydata)
# do the fit
## Try numericDeriv() function
Cform <- ydata ~ p1*cos(p2*xdata) + p2*sin(p1*xdata)</pre>
Ctheta<-c("p1","p2")</pre>
Cstart<-c(p1=p1, p2=p2)
nmodc1<-nlsalt::nlsModel(form=Cform, data=Cdata, start=Cstart, wts=NULL, upper=NULL, scaleOffset = 0, n
## Registered S3 methods overwritten by 'nlsalt':
##
    method
                      from
##
     anova.nls
                       stats
##
     coef.nls
                       stats
##
     confint.nls
                      stats
##
    deviance.nls
                      stats
    df.residual.nls
##
                       stats
##
    fitted.nls
                      stats
##
    formula.nls
                     stats
##
    logLik.nls
                      stats
##
    nobs.nls
                       stats
##
    plot.profile.nls stats
##
    predict.nls
                      stats
##
                       stats
    print.nls
##
    print.summary.nls stats
##
    profile.nls
    residuals.nls
                       stats
##
     summary.nls
                       stats
##
     vcov.nls
                       stats
##
     weights.nls
                       stats
## Running nlsModel -- just set getPars
## function ()
## - attr(*, "srcref")= 'srcref' int [1:8] 38 26 38 65 26 65 1579 1579
   ..- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f267bb2320>
## NULL
## par:1 0.2
## [1] 0.7392015 0.7471673 0.7706004 0.8613725 1.0000000 1.0829458 1.1577458
## [8] 1.1462098 1.0407158 0.8843125
## attr(,"gradient")
##
              [,1]
                         [,2]
## [1,] 1.0875197 -1.6881341
## [2,] 0.9693692 -1.5259328
## [3,] 0.9013955 -1.3207711
## [4,] 0.8831381 -0.7418979
## [5,] 1.0000000 0.0000000
## [6,] 1.0769930 0.3945202
## [7,] 1.0583038 0.6467959
## [8,] 0.9240078 0.4692800
```

```
## [10,] 0.2733069 -1.3500201
print(str(nmodc1))
## List of 16
## $ resid
                :function ()
     ..- attr(*, "srcref")= 'srcref' int [1:8] 129 15 129 30 22 37 1670 1670
     ...- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f267bb2320>
##
  $ fitted
               :function ()
##
     ..- attr(*, "srcref")= 'srcref' int [1:8] 130 16 130 29 23 36 1671 1671
##
    ... - attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f267bb2320>
  $ formula
               :function ()
     ..- attr(*, "srcref")= 'srcref' int [1:8] 131 17 131 31 24 38 1672 1672
##
    ....- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f267bb2320>
##
##
   $ deviance :function ()
    ..- attr(*, "srcref")= 'srcref' int [1:8] 132 18 132 31 25 38 1673 1673
##
     ...- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f267bb2320>
##
                :function ()
    ..- attr(*, "srcref")= 'srcref' int [1:8] 133 13 13 26 20 33 1674 1674
##
     ... - attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f267bb2320>
##
    $ gradient :function ()
##
    ..- attr(*, "srcref")= 'srcref' int [1:8] 134 18 134 57 25 64 1675 1675
    ... - attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f267bb2320>
##
##
               :function ()
   $ conv
     ..- attr(*, "srcref")= 'srcref' int [1:8] 135 14 135 34 21 41 1676 1676
##
    ....- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f267bb2320>
##
               :function ()
     ..- attr(*, "srcref")= 'srcref' int [1:8] 136 14 136 42 21 49 1677 1677
##
    ....- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f267bb2320>
##
   $ setVarying:function (vary = rep_len(TRUE, np))
    ..- attr(*, "srcref")= 'srcref' int [1:8] 137 20 160 7 27 14 1678 1701
     ...- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f267bb2320>
##
   $ setPars
              :function (newPars)
##
    ..- attr(*, "srcref")= 'srcref' int [1:8] 161 17 168 7 24 14 1702 1709
     ...- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f267bb2320>
##
   $ getPars
              :function ()
##
    ..- attr(*, "srcref")= 'srcref' int [1:8] 169 17 169 36 24 43 1710 1710
     ...- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f267bb2320>
##
   $ getAllPars:function ()
##
     ..- attr(*, "srcref")= 'srcref' int [1:8] 170 20 170 39 27 46 1711 1711
    ... - attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f267bb2320>
##
##
   $ getEnv
               :function ()
##
     ..- attr(*, "srcref")= 'srcref' int [1:8] 171 16 171 29 23 36 1712 1712
##
    ....- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f267bb2320>
               :function ()
##
   $ trace
    ..- attr(*, "srcref")= 'srcref' int [1:8] 172 15 178 7 22 14 1713 1719
     ...- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f267bb2320>
##
##
               :function ()
    ..- attr(*, "srcref")= 'srcref' int [1:8] 179 14 179 32 21 39 1720 1720
##
    ....- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f267bb2320>
##
   $ predict :function (newdata = list(), qr = FALSE)
    ..- attr(*, "srcref")= 'srcref' int [1:8] 180 17 181 56 24 56 1721 1722
##
##
    ....- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f267bb2320>
## - attr(*, "class")= chr "nlsModel"
```

[9,] 0.5782596 -0.3060353

```
## NULL
# nmodc1a<-nlsalt::nlsModel(form=Cform, data=Cdata, start=Cstart, wts=NULL, upper=NULL, scaleOffset = 0
# print(str(nmodc1a))
# Data for Hobbs problem
ydat <- c(5.308, 7.24, 9.638, 12.866, 17.069, 23.192, 31.443,
            38.558, 50.156, 62.948, 75.995, 91.972) # for testing
tdat <- seq_along(ydat) # for testing
# A simple starting vector -- must have named parameters for nlxb, nls, wrapnlsr.
start1 <- c(b1=1, b2=1, b3=1)
eunsc <-
           y \sim b1/(1+b2*exp(-b3*tt))
str(eunsc)
## Class 'formula' language y \sim b1/(1 + b2 * exp(-b3 * tt))
   ..- attr(*, ".Environment")=<environment: R_GlobalEnv>
# Can we convert a string form of this "model" to a formula
ceunsc <- " y ~ b1/(1+b2*exp(-b3*tt))"
str(ceunsc)
## chr " y ~ b1/(1+b2*exp(-b3*tt))"
weeddata1 <- data.frame(y=ydat, tt=tdat)</pre>
## Now ready to try things out.
library(nlsalt) # ?? needed because base R does not export nlsModel()
##
## Attaching package: 'nlsalt'
## The following objects are masked from 'package:stats':
##
##
       asOneSidedFormula, getInitial, nlminb, nls, nls.control,
##
      NLSstAsymptotic, NLSstClosestX, NLSstLfAsymptote, NLSstRtAsymptote,
##
       numericDeriv, selfStart, setNames, sortedXyData
nmodh1<-nlsalt::nlsModel(form=eunsc, data=weeddata1, start=start1, wts=NULL, upper=NULL, scaleOffset = v
## Running nlsModel -- just set getPars
## function ()
## - attr(*, "srcref")= 'srcref' int [1:8] 38 26 38 65 26 65 1579 1579
##
   ..- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f267bb2320>
## NULL
## par:1 1 1
## [1] 0.7310586 0.8807971 0.9525741 0.9820138 0.9933071 0.9975274 0.9990889
## [8] 0.9996646 0.9998766 0.9999546 0.9999833 0.9999939
## attr(,"gradient")
##
              [,1]
                            [,2]
                                         [,3]
## [1,] 0.7310586 -1.966119e-01 1.966119e-01
## [2,] 0.8807971 -1.049936e-01 2.099872e-01
## [3,] 0.9525741 -4.517667e-02 1.355300e-01
## [4,] 0.9820138 -1.766271e-02 7.065082e-02
## [5,] 0.9933072 -6.648056e-03 3.324027e-02
## [6,] 0.9975274 -2.466522e-03 1.479905e-02
## [7,] 0.9990890 -9.102300e-04 6.371543e-03
## [8,] 0.9996646 -3.352463e-04 2.681896e-03
```

```
## [10,] 0.9999546 -4.540384e-05 4.539490e-04
## [11,] 0.9999833 -1.670420e-05 1.837090e-04
## [12,] 0.9999939 -6.139278e-06 7.373095e-05
str(nmodh1)
## List of 16
   $ resid
               :function ()
    ..- attr(*, "srcref")= 'srcref' int [1:8] 129 15 129 30 22 37 1670 1670
     ...- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f267bb2320>
## $ fitted
               :function ()
    ..- attr(*, "srcref")= 'srcref' int [1:8] 130 16 130 29 23 36 1671 1671
##
    ....- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f267bb2320>
## $ formula
              :function ()
    ..- attr(*, "srcref")= 'srcref' int [1:8] 131 17 131 31 24 38 1672 1672
##
##
    ....- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f267bb2320>
## $ deviance :function ()
##
    ..- attr(*, "srcref")= 'srcref' int [1:8] 132 18 132 31 25 38 1673 1673
##
    ....- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f267bb2320>
## $ lhs
               :function ()
    ..- attr(*, "srcref")= 'srcref' int [1:8] 133 13 13 26 20 33 1674 1674
    ....- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f267bb2320>
##
##
   $ gradient :function ()
##
    ..- attr(*, "srcref")= 'srcref' int [1:8] 134 18 134 57 25 64 1675 1675
     ...- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f267bb2320>
## $ conv
               :function ()
    ..- attr(*, "srcref")= 'srcref' int [1:8] 135 14 135 34 21 41 1676 1676
##
    ....- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f267bb2320>
## $ incr
               :function ()
##
    ..- attr(*, "srcref")= 'srcref' int [1:8] 136 14 136 42 21 49 1677 1677
    ...- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f267bb2320>
##
## $ setVarying:function (vary = rep_len(TRUE, np))
    ..- attr(*, "srcref")= 'srcref' int [1:8] 137 20 160 7 27 14 1678 1701
##
    ....- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f267bb2320>
## $ setPars
              :function (newPars)
    ..- attr(*, "srcref")= 'srcref' int [1:8] 161 17 168 7 24 14 1702 1709
    ... - attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f267bb2320>
##
##
               :function ()
   $ getPars
##
   ..- attr(*, "srcref")= 'srcref' int [1:8] 169 17 169 36 24 43 1710 1710
     ...- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f267bb2320>
##
   $ getAllPars:function ()
##
    ..- attr(*, "srcref")= 'srcref' int [1:8] 170 20 170 39 27 46 1711 1711
##
    ....- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f267bb2320>
##
   $ getEnv
               :function ()
##
    ..- attr(*, "srcref")= 'srcref' int [1:8] 171 16 171 29 23 36 1712 1712
    ...- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f267bb2320>
##
               :function ()
    ..- attr(*, "srcref")= 'srcref' int [1:8] 172 15 178 7 22 14 1713 1719
##
    ...- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f267bb2320>
##
## $ Rmat
               :function ()
    ..- attr(*, "srcref")= 'srcref' int [1:8] 179 14 179 32 21 39 1720 1720
    ....- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f267bb2320>
##
##
   $ predict
              :function (newdata = list(), qr = FALSE)
   ..- attr(*, "srcref")= 'srcref' int [1:8] 180 17 181 56 24 56 1721 1722
```

[9,] 0.9998766 -1.233816e-04 1.110412e-03

```
## ...- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f267bb2320>
## - attr(*, "class")= chr "nlsModel"
ls.str(nmodh1)
## conv : function ()
## deviance : function ()
## fitted : function ()
## formula : function ()
## getAllPars : function ()
## getEnv : function ()
## getPars : function ()
## gradient : function ()
## incr : function ()
## lhs : function ()
## predict : function (newdata = list(), qr = FALSE)
## resid : function ()
## Rmat : function ()
## setPars : function (newPars)
## setVarying : function (vary = rep_len(TRUE, np))
## trace : function ()
print(nmodh1)
## $resid
## function() resid
## <bytecode: 0x55f267bd7960>
## <environment: 0x55f269b02028>
##
## $fitted
## function() rhs
## <bytecode: 0x55f267a3c0a8>
## <environment: 0x55f269b02028>
## $formula
## function() form
## <bytecode: 0x55f267a3b008>
## <environment: 0x55f269b02028>
##
## $deviance
## function() dev
## <bytecode: 0x55f267a3fc80>
## <environment: 0x55f269b02028>
##
## $1hs
## function() lhs
## <bytecode: 0x55f267a3eba8>
## <environment: 0x55f269b02028>
## $gradient
## function() .swts * attr(rhs, "gradient")
## <bytecode: 0x55f267a41900>
## <environment: 0x55f269b02028>
##
## $conv
```

```
## function() convCrit()
## <bytecode: 0x55f267a40d30>
## <environment: 0x55f269b02028>
##
## $incr
## function() qr.coef(QR, resid)
## <bytecode: 0x55f267a44038>
## <environment: 0x55f269b02028>
##
## $setVarying
## function(vary = rep_len(TRUE, np)) {
                     np <- length(useParams)</pre>
##
         useParams <<- useP <-
##
##
                         if(is.character(vary)) {
##
                              temp <- logical(np)</pre>
##
                              temp[unlist(ind[vary])] <- TRUE</pre>
##
##
                         } else if(is.logical(vary) && length(vary) != np)
##
                              stop("setVarying : 'vary' length must match length of parameters")
##
                         else
##
                              vary # envir = thisEnv
##
         gradCall[[length(gradCall) - 1L]] <<- useP</pre>
         if(all(useP)) {
##
##
             setPars <<- setPars.noVarying</pre>
##
             getPars <<- getPars.noVarying</pre>
##
             getRHS <<- getRHS.noVarying</pre>
                      <-- length(useP)
##
             npar
         } else {
##
##
             setPars <<- setPars.varying</pre>
##
             getPars <<- getPars.varying</pre>
##
             getRHS <<- getRHS.varying</pre>
##
             npar
                      <<- sum(useP)
         }
##
##
         }
## <bytecode: 0x55f267a466c8>
## <environment: 0x55f269b02028>
##
## $setPars
## function(newPars) {
##
         setPars(newPars)
##
         resid <-- .swts * (lhs - (rhs <-- getRHS())) # envir = thisEnv {2 x}
##
                <-- sum(resid^2) # envir = thisEnv
         if(length(gr <- attr(rhs, "gradient")) == 1L) gr <- c(gr)
##
##
         QR <<- qr(.swts * gr) # envir = thisEnv
##
         (QR$rank < min(dim(QR$qr))) # to catch the singular gradient matrix
         }
##
## <bytecode: 0x55f267a57350>
## <environment: 0x55f269b02028>
##
## $getPars
## function() getPars()
## <bytecode: 0x55f26808eba0>
## <environment: 0x55f269b02028>
##
```

```
## $getAllPars
## function() getPars()
## <bytecode: 0x55f268091f18>
## <environment: 0x55f269b02028>
## $getEnv
## function() env
## <bytecode: 0x55f2680913b8>
## <environment: 0x55f269b02028>
##
## $trace
## function() {
         d <- getOption("digits")</pre>
##
         cat(sprintf("%-*s (%.2e): par = (%s)\n", d+4L+2L*(scaleOffset > 0),
##
##
                 formatC(dev, digits=d, flag="#"),
##
                 convCrit(),
##
                 paste(vapply(getPars(), format, ""), collapse=" ")))
         }
##
## <bytecode: 0x55f268094148>
   <environment: 0x55f269b02028>
##
## $Rmat
## function() qr.R(QR)
## <bytecode: 0x55f268098fc8>
## <environment: 0x55f269b02028>
##
## $predict
## function(newdata = list(), qr = FALSE)
                    eval(form[[3L]], as.list(newdata), env)
## <bytecode: 0x55f26809bc40>
## <environment: 0x55f269b02028>
##
## attr(,"class")
## [1] "nlsModel"
```

Examining the nlsModel output

The output of nlsModel is an object of class attribute "nlsModel" with 16 elements. (??Is this always the case, or can the call cause elements to be added or not produced?)

resid()

This function computes the residuals in the current environment. (?? Is this .GlobalEnv? Can that environment be changed i.e., is it an argument to resid()?)

```
cat("Display Croucher residuals from nmodc1 as currently set:\n")
## Display Croucher residuals from nmodc1 as currently set:
print(nmodc1$resid())
## [1] -0.03983251 -0.04670526 -0.07524643 0.17767754 0.97389000 1.32848416
## [7] 0.75316421 -0.22663381 -1.77169083 -2.30432252
```

```
cat("Display Hobbs residuals from nmodc1 as currently set:\n")
## Display Hobbs residuals from nmodc1 as currently set:
print(nmodh1$resid())
   [1] 4.576941 6.359203 8.685426 11.883986 16.075693 22.194473 30.443911
  [8] 37.558335 49.156123 61.948045 74.995017 90.972006
fitted()
This function computes the fitted values of the nonlinear model in the current environment. The output
includes an attribute, "gradient," which is actually the Jacobian matrix of which the k, j element is the
cat("Display Croucher fitted model values from nmodc1 as currently set:\n")
## Display Croucher fitted model values from nmodc1 as currently set:
print(nmodc1$fitted())
    [1] 0.7392015 0.7471673 0.7706004 0.8613725 1.0000000 1.0829458 1.1577458
   [8] 1.1462098 1.0407158 0.8843125
## attr(,"gradient")
##
              [,1]
                         [,2]
## [1,] 1.0875197 -1.6881341
## [2,] 0.9693692 -1.5259328
## [3,] 0.9013955 -1.3207711
## [4,] 0.8831381 -0.7418979
## [5,] 1.0000000 0.0000000
## [6,] 1.0769930 0.3945202
## [7,] 1.0583038 0.6467959
## [8,] 0.9240078 0.4692800
## [9,] 0.5782596 -0.3060353
## [10,] 0.2733069 -1.3500201
cat("Display Hobbs fitted model values from nmodc1 as currently set:\n")
## Display Hobbs fitted model values from nmodc1 as currently set:
print(nmodh1$fitted())
    [1] 0.7310586 0.8807971 0.9525741 0.9820138 0.9933071 0.9975274 0.9990889
    [8] 0.9996646 0.9998766 0.9999546 0.9999833 0.9999939
## attr(,"gradient")
##
              [,1]
                            [,2]
  [1,] 0.7310586 -1.966119e-01 1.966119e-01
##
   [2,] 0.8807971 -1.049936e-01 2.099872e-01
##
  [3,] 0.9525741 -4.517667e-02 1.355300e-01
##
## [4,] 0.9820138 -1.766271e-02 7.065082e-02
## [5,] 0.9933072 -6.648056e-03 3.324027e-02
## [6,] 0.9975274 -2.466522e-03 1.479905e-02
## [7,] 0.9990890 -9.102300e-04 6.371543e-03
## [8,] 0.9996646 -3.352463e-04 2.681896e-03
## [9,] 0.9998766 -1.233816e-04 1.110412e-03
## [10,] 0.9999546 -4.540384e-05 4.539490e-04
## [11,] 0.9999833 -1.670420e-05 1.837090e-04
## [12,] 0.9999939 -6.139278e-06 7.373095e-05
```

```
formula()
cat("Display Croucher formula from nmodc1 as currently set:\n")
## Display Croucher formula from nmodc1 as currently set:
print(nmodc1$formula())
## ydata ~ p1 * cos(p2 * xdata) + p2 * sin(p1 * xdata)
cat("Display Hobbs formula from nmodc1 as currently set:\n")
## Display Hobbs formula from nmodc1 as currently set:
print(nmodh1$formula())
## y ~ b1/(1 + b2 * exp(-b3 * tt))
deviance()
cat("Display Croucher deviance from nmodc1 as currently set:\n")
## Display Croucher deviance from nmodc1 as currently set:
print(nmodc1$deviance())
## [1] 11.82174
cat("Display Hobbs deviance from nmodc1 as currently set:\n")
## Display Hobbs deviance from nmodc1 as currently set:
print(nmodh1$deviance())
## [1] 23520.58
lhs()
cat("Display Croucher lhs from nmodc1 as currently set:\n")
## Display Croucher lhs from nmodc1 as currently set:
print(nmodc1$lhs())
## [1] 0.699369 0.700462 0.695354 1.039050 1.973890 2.411430 1.910910
   [8] 0.919576 -0.730975 -1.420010
cat("Display Hobbs lhs from nmodc1 as currently set:\n")
## Display Hobbs lhs from nmodc1 as currently set:
print(nmodh1$lhs())
```

```
gradient()
cat("Display Croucher gradient from nmodc1 as currently set:\n")
```

[1] 5.308 7.240 9.638 12.866 17.069 23.192 31.443 38.558 50.156 62.948

[11] 75.995 91.972

```
## Display Croucher gradient from nmodc1 as currently set:
print(nmodc1$gradient())
##
              [,1]
                         [,2]
##
   [1,] 1.0875197 -1.6881341
##
   [2,] 0.9693692 -1.5259328
## [3,] 0.9013955 -1.3207711
## [4,] 0.8831381 -0.7418979
## [5,] 1.0000000 0.0000000
##
   [6,] 1.0769930 0.3945202
## [7,] 1.0583038 0.6467959
## [8,] 0.9240078 0.4692800
## [9,] 0.5782596 -0.3060353
## [10,] 0.2733069 -1.3500201
cat("Display Hobbs gradient from nmodc1 as currently set:\n")
## Display Hobbs gradient from nmodc1 as currently set:
print(nmodh1$gradient())
##
                            [,2]
              [,1]
                                         [,3]
##
    [1,] 0.7310586 -1.966119e-01 1.966119e-01
##
   [2,] 0.8807971 -1.049936e-01 2.099872e-01
  [3,] 0.9525741 -4.517667e-02 1.355300e-01
   [4,] 0.9820138 -1.766271e-02 7.065082e-02
##
   [5,] 0.9933072 -6.648056e-03 3.324027e-02
  [6,] 0.9975274 -2.466522e-03 1.479905e-02
## [7,] 0.9990890 -9.102300e-04 6.371543e-03
   [8,] 0.9996646 -3.352463e-04 2.681896e-03
## [9,] 0.9998766 -1.233816e-04 1.110412e-03
## [10,] 0.9999546 -4.540384e-05 4.539490e-04
## [11,] 0.9999833 -1.670420e-05 1.837090e-04
## [12,] 0.9999939 -6.139278e-06 7.373095e-05
conv()
cat("Display Croucher conv from nmodc1 as currently set:\n")
## Display Croucher conv from nmodc1 as currently set:
print(nmodc1$conv())
## [1] 0.680674
cat("Display Hobbs conv from nmodc1 as currently set:\n")
## Display Hobbs conv from nmodc1 as currently set:
print(nmodh1$conv())
## [1] 2.076871
incr()
```

?? This function appears to return the current search direction from the Gauss-Newton equations. We need to be very CAREFUL as we augment the nls() procedure to allow for Levenberg-Marquardt stabilizations

```
and some different approaches to the solution iteration.
```

```
cat("Display Croucher incr from nmodc1 as currently set:\n")
## Display Croucher incr from nmodc1 as currently set:
print(nmodc1$incr())
## [1] 0.4951056 0.6604326
cat("Display Hobbs incr from nmodc1 as currently set:\n")
## Display Hobbs incr from nmodc1 as currently set:
print(nmodh1$incr())
## [1]
         49.97713 -248.39739 -379.03452
setVarying(vary = rep_len(TRUE, np))
?? This seems to return the number of free (i.e., unconstrained) parameters in the current nonlinear model.
cat("Display Croucher setVarying from nmodc1 as currently set:\n")
## Display Croucher setVarying from nmodc1 as currently set:
print(nmodc1$setVarying())
## [1] 2
cat("Display Hobbs setVarying from nmodc1 as currently set:\n")
## Display Hobbs setVarying from nmodc1 as currently set:
print(nmodh1$setVarying())
## [1] 3
setPars(newPars)
?? This function does not seem to execute. Listing it shows some quite involved operations on the weghts,
the model, the deviance and the QR decomposition of the Jacobian.
newPars <- c(p1=0.95, p2=0.15)
cat("Display Croucher setPars(newPars) from nmodc1 as currently set:\n")
print(nmodc1$setPars(newPars)())
```

```
cat("Display Hobbs setPars(newPars) from nmodc1 as currently set:\n")
newPars<- c(b1=1.1, b2=1.4, b3=0.1)
print(nmodh1$setPars(newPars)())
```

getPars()

This function and getAllPars() are defined identically in nlsModel() as

```
getPars = function() getPars(),
getAllPars = function() getPars(),
```

within the assignment of the list elements in creating the "m" object at the end of nlsModel().

Prior to this, we have

```
cat("Display Croucher getPars from nmodc1 as currently set:\n")
## Display Croucher getPars from nmodc1 as currently set:
print(nmodc1$fitted())
   [1] 0.7392015 0.7471673 0.7706004 0.8613725 1.0000000 1.0829458 1.1577458
   [8] 1.1462098 1.0407158 0.8843125
##
## attr(,"gradient")
##
                         [,2]
              [,1]
## [1,] 1.0875197 -1.6881341
## [2,] 0.9693692 -1.5259328
## [3,] 0.9013955 -1.3207711
## [4,] 0.8831381 -0.7418979
## [5,] 1.0000000 0.0000000
## [6,] 1.0769930 0.3945202
## [7,] 1.0583038 0.6467959
## [8,] 0.9240078 0.4692800
## [9,] 0.5782596 -0.3060353
## [10,] 0.2733069 -1.3500201
cat("Display Hobbs getPars from nmodc1 as currently set:\n")
## Display Hobbs getPars from nmodc1 as currently set:
print(nmodh1$getPars())
## b1 b2 b3
## 1 1 1
getAllPars()
This function returns all parameters for the current nonlinear model as vector of named quantities. It is NOT
a list as shown in the example.
cat("Display Croucher getAllPars from nmodc1 as currently set:\n")
## Display Croucher getAllPars from nmodc1 as currently set:
print(str(nmodc1$getAllPars()))
  Named num [1:2] 1 0.2
   - attr(*, "names")= chr [1:2] "p1" "p2"
## NULL
print(nmodc1$getAllPars())
## p1 p2
## 1.0 0.2
is.list(nmodc1$getAllPars())
## [1] FALSE
is.numeric(nmodc1$getAllPars())
## [1] TRUE
cat("Display Hobbs getAllPars from nmodc1 as currently set:\n")
```

```
## Display Hobbs getAllPars from nmodc1 as currently set:
print(nmodh1$getAllPars())
## b1 b2 b3
## 1 1 1
getEnv()
The getEnv() function returns the identifier of the current environment for the nonlinear model in focus. By
using the ls() function we can display the names of the objects available in this environment.
cat("Display Croucher fitted model values from nmodc1 as currently set:\n")
## Display Croucher fitted model values from nmodc1 as currently set:
print(nmodc1$getEnv())
## <environment: 0x55f2680a1ee0>
cat("ls(nmodc1$getEnv():")
## ls(nmodc1$getEnv():
print(ls(nmodc1$getEnv()))
## [1] "p1"
                         "xdata" "ydata"
                "p2"
cat("Display Hobbs fitted model values from nmodc1 as currently set:\n")
## Display Hobbs fitted model values from nmodc1 as currently set:
print(nmodh1$getEnv())
## <environment: 0x55f269b01c70>
print(ls(nmodh1$getEnv()))
## [1] "b1" "b2" "b3" "tt" "y"
trace()
The "trace" function seems to display information about the current state of the model estimation.
ISSUE: because there is a "trace" argument to nls() (and to functions in package nlsr and others), would it
not be better to use tracefn()??
Output from the trace() appears to be the current evaluated deviance (essentially the residual sum of
squares), then in brackets the value of the convCrit() function – the value that is compared to a convergence
tolerance, and then the current parameters. In printing the evaluated function, NULL is appended. Is this
because no return value is provided??
cat("Display Croucher trace from nmodc1 as currently set:\n")
## Display Croucher trace from nmodc1 as currently set:
print(nmodc1$trace())
## 11.82174
                (6.81e-01): par = (1 0.2)
## NULL
```

cat("Display Hobbs trace from nmodc1 as currently set:\n")

```
## Display Hobbs trace from nmodc1 as currently set:
print(nmodh1$trace())
```

```
## 23520.58 (2.08e+00): par = (1 1 1)
## NULL
```

Rmat()

"Rmat" appears to return the current R matrix of the QR decomposition.

This could lead to some confusion if we build an augmented matrix for the Levenberg-Marquardt and LM + Nash variant of the stabilization. We may need to watch this carefully to see where it is used. A search shows ONLY usage within the packages nlspkg and nlsalt to compute XtXinv, to get the variance-covariance of the parameters in summary.nls().

?? We need to decide how to generate Rmat for the purposes of getting this information. In particular, in running the estimation iteration, we augment the matrix, so it is important to think how to get the right information for summary.nls.

```
cat("Display Croucher Rmat from nmodc1 as currently set:\n")
```

Display Croucher Rmat from nmodc1 as currently set:

print(nmodc1\$Rmat())

```
## [,1] [,2]
## [1,] -2.873607 1.448954
## [2,] 0.000000 2.843251
cat("Display Hobbs Rmat from nmodc1 as currently set:\n")
```

Display Hobbs Rmat from nmodc1 as currently set:

print(nmodh1\$Rmat())

```
## [,1] [,2] [,3]
## [1,] -3.340785 0.09192216 -0.1753546
## [2,] 0.000000 0.20888840 -0.2499881
## [3,] 0.000000 0.00000000 -0.1193344
```

```
predict(newdata = list(), qr = FALSE)
```

This function allows predicted values of the model to be calculated for dependent variable data in the list "newdata."

?? What does gr=FALSE do??

```
cat("Display Croucher predict from nmodc1 as currently set:\n")
```

```
## Display Croucher predict from nmodc1 as currently set:
```

```
cat("first with no new parameters -- we get the fitted values\n")
```

```
## first with no new parameters -- we get the fitted values
print(nmodc1$predict())
```

```
## [1] 0.7392015 0.7471673 0.7706004 0.8613725 1.0000000 1.0829458 1.1577458
## [8] 1.1462098 1.0407158 0.8843125
```

```
cat("Now with some new data\n")
## Now with some new data
newcdata<-data.frame(xdata=0.1, ydata=1.1)</pre>
print(nmodc1$predict(newdata=newcdata))
## [1] 1.019767
cat("Display Hobbs predict from nmodc1 as currently set:\n")
## Display Hobbs predict from nmodc1 as currently set:
cat("first with no new parameters -- we get the fitted values \n")
\#\# first with no new parameters -- we get the fitted values
print(nmodh1$predict())
    [1] 0.7310586 0.8807971 0.9525741 0.9820138 0.9933071 0.9975274 0.9990889
    [8] 0.9996646 0.9998766 0.9999546 0.9999833 0.9999939
cat("Now with some new data\n")
## Now with some new data
newhdata<-data.frame(tt=c(13,14), y=c(120,200))
print(nmodh1$predict(newdata=newhdata))
## [1] 0.9999977 0.9999992
cat("trying again with qr=TRUE\n")
## trying again with qr=TRUE
print(nmodh1$predict(newdata=newhdata, qr=TRUE))
## [1] 0.9999977 0.9999992
Using "qr=TRUE" does not seem to make any difference. Need to delve further??
```

Attempt to understand nlsModel in detail

A new file nlsModelx.R was created that establishes the nlsModelx() function.

```
nmodc1<-nlsalt::nlsModelx(form=Cform, data=Cdata, start=Cstart, wts=NULL, upper=NULL, scaleOffset = 0,
## env: let us list the content --character(0)
## Running nlsModel -- just set getPars
## function ()
  - attr(*, "srcref")= 'srcref' int [1:8] 19 26 19 65 26 65 1747 1747
     ..- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f2682fd2f0>
##
## NULL
## par:1 0.2
## [1] 0.7392015 0.7471673 0.7706004 0.8613725 1.0000000 1.0829458 1.1577458
## [8] 1.1462098 1.0407158 0.8843125
## attr(,"gradient")
##
              [,1]
                         [,2]
## [1,] 1.0875197 -1.6881341
## [2,] 0.9693692 -1.5259328
```

```
## [3,] 0.9013955 -1.3207711
## [4,] 0.8831381 -0.7418979
## [5,] 1.0000000 0.0000000
## [6,] 1.0769930 0.3945202
## [7,] 1.0583038 0.6467959
## [8,] 0.9240078 0.4692800
## [9.] 0.5782596 -0.3060353
## [10,] 0.2733069 -1.3500201
print(str(nmodc1))
## List of 16
## $ resid
                :function ()
     ..- attr(*, "srcref")= 'srcref' int [1:8] 110 15 110 30 22 37 1838 1838
##
    ....- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f2682fd2f0>
   $ fitted
                :function ()
    ..- attr(*, "srcref")= 'srcref' int [1:8] 111 16 111 29 23 36 1839 1839
##
     ...- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f2682fd2f0>
##
   $ formula
              :function ()
    ..- attr(*, "srcref")= 'srcref' int [1:8] 112 17 112 31 24 38 1840 1840
##
    ....- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f2682fd2f0>
##
   $ deviance :function ()
##
    ..- attr(*, "srcref")= 'srcref' int [1:8] 113 18 113 31 25 38 1841 1841
    ... - attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f2682fd2f0>
##
##
  $ lhs
               :function ()
    ..- attr(*, "srcref")= 'srcref' int [1:8] 114 13 114 26 20 33 1842 1842
##
    ....- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f2682fd2f0>
##
## $ gradient :function ()
     ..- attr(*, "srcref")= 'srcref' int [1:8] 115 18 115 57 25 64 1843 1843
##
    ....- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f2682fd2f0>
##
               :function ()
##
   $ conv
    ..- attr(*, "srcref")= 'srcref' int [1:8] 116 14 116 34 21 41 1844 1844
     ...- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f2682fd2f0>
##
##
   $ incr
               :function ()
##
    ..- attr(*, "srcref")= 'srcref' int [1:8] 117 14 117 42 21 49 1845 1845
     ... - attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f2682fd2f0>
   $ setVarying:function (vary = rep_len(TRUE, np))
##
    ..- attr(*, "srcref")= 'srcref' int [1:8] 118 20 141 7 27 14 1846 1869
##
     ... - attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f2682fd2f0>
##
   $ setPars
              :function (newPars)
     ..- attr(*, "srcref")= 'srcref' int [1:8] 142 17 149 7 24 14 1870 1877
##
##
    ....- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f2682fd2f0>
##
   $ getPars
              :function ()
##
     ..- attr(*, "srcref")= 'srcref' int [1:8] 150 17 150 36 24 43 1878 1878
    ....- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f2682fd2f0>
##
##
   $ getAllPars:function ()
     ..- attr(*, "srcref")= 'srcref' int [1:8] 151 20 151 39 27 46 1879 1879
     ...- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f2682fd2f0>
##
##
               :function ()
##
    ..- attr(*, "srcref")= 'srcref' int [1:8] 152 16 152 29 23 36 1880 1880
    ....- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f2682fd2f0>
##
   $ trace
                :function ()
    ..- attr(*, "srcref")= 'srcref' int [1:8] 153 15 159 7 22 14 1881 1887
##
##
     ... - attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f2682fd2f0>
   $ Rmat
               :function ()
```

```
..- attr(*, "srcref")= 'srcref' int [1:8] 160 14 160 32 21 39 1888 1888
   ...- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f2682fd2f0>
##
              :function (newdata = list(), qr = FALSE)
     ..- attr(*, "srcref")= 'srcref' int [1:8] 161 17 162 56 24 56 1889 1890
##
    ....- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f2682fd2f0>
## - attr(*, "class")= chr "nlsModel"
## NULL
nmodh1<-nlsalt::nlsModelx(form=eunsc, data=weeddata1, start=start1, wts=NULL, upper=NULL, scaleOffset =
## env: let us list the content --character(0)
## Running nlsModel -- just set getPars
## function ()
## - attr(*, "srcref")= 'srcref' int [1:8] 19 26 19 65 26 65 1747 1747
   ..- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f2682fd2f0>
## NULL
## par:1 1 1
## [1] 0.7310586 0.8807971 0.9525741 0.9820138 0.9933071 0.9975274 0.9990889
   [8] 0.9996646 0.9998766 0.9999546 0.9999833 0.9999939
## attr(,"gradient")
##
              [,1]
                            [,2]
## [1,] 0.7310586 -1.966119e-01 1.966119e-01
## [2,] 0.8807971 -1.049936e-01 2.099872e-01
## [3,] 0.9525741 -4.517667e-02 1.355300e-01
## [4,] 0.9820138 -1.766271e-02 7.065082e-02
## [5,] 0.9933072 -6.648056e-03 3.324027e-02
## [6,] 0.9975274 -2.466522e-03 1.479905e-02
## [7,] 0.9990890 -9.102300e-04 6.371543e-03
## [8,] 0.9996646 -3.352463e-04 2.681896e-03
## [9,] 0.9998766 -1.233816e-04 1.110412e-03
## [10,] 0.9999546 -4.540384e-05 4.539490e-04
## [11,] 0.9999833 -1.670420e-05 1.837090e-04
## [12,] 0.9999939 -6.139278e-06 7.373095e-05
str(nmodh1)
## List of 16
               :function ()
## $ resid
    ..- attr(*, "srcref")= 'srcref' int [1:8] 110 15 110 30 22 37 1838 1838
     ...- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f2682fd2f0>
## $ fitted
               :function ()
    ..- attr(*, "srcref")= 'srcref' int [1:8] 111 16 111 29 23 36 1839 1839
##
    ....- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f2682fd2f0>
   $ formula
##
              :function ()
    ..- attr(*, "srcref")= 'srcref' int [1:8] 112 17 112 31 24 38 1840 1840
##
##
    ...- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f2682fd2f0>
## $ deviance :function ()
##
     ..- attr(*, "srcref")= 'srcref' int [1:8] 113 18 113 31 25 38 1841 1841
    ....- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f2682fd2f0>
##
## $ lhs
               :function ()
    ..- attr(*, "srcref")= 'srcref' int [1:8] 114 13 114 26 20 33 1842 1842
    ....- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f2682fd2f0>
##
##
   $ gradient :function ()
##
   ..- attr(*, "srcref")= 'srcref' int [1:8] 115 18 115 57 25 64 1843 1843
     ... - attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f2682fd2f0>
```

```
##
                :function ()
##
    ..- attr(*, "srcref")= 'srcref' int [1:8] 116 14 116 34 21 41 1844 1844
##
     ...- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f2682fd2f0>
##
   $ incr
                :function ()
##
     ..- attr(*, "srcref")= 'srcref' int [1:8] 117 14 117 42 21 49 1845 1845
     ... - attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f2682fd2f0>
##
   $ setVarying:function (vary = rep len(TRUE, np))
     ..- attr(*, "srcref")= 'srcref' int [1:8] 118 20 141 7 27 14 1846 1869
##
##
    ....- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f2682fd2f0>
##
   $ setPars
               :function (newPars)
    ..- attr(*, "srcref")= 'srcref' int [1:8] 142 17 149 7 24 14 1870 1877
     ...- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f2682fd2f0>
##
##
   $ getPars
               :function ()
    ..- attr(*, "srcref")= 'srcref' int [1:8] 150 17 150 36 24 43 1878 1878
##
##
     ... - attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f2682fd2f0>
##
   $ getAllPars:function ()
##
    ..- attr(*, "srcref")= 'srcref' int [1:8] 151 20 151 39 27 46 1879 1879
##
     ... - attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f2682fd2f0>
##
   $ getEnv
                :function ()
     ..- attr(*, "srcref")= 'srcref' int [1:8] 152 16 152 29 23 36 1880 1880
##
##
     ... - attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f2682fd2f0>
                :function ()
     ..- attr(*, "srcref")= 'srcref' int [1:8] 153 15 159 7 22 14 1881 1887
##
    ....- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f2682fd2f0>
##
##
   $ Rmat
                :function ()
    ..- attr(*, "srcref")= 'srcref' int [1:8] 160 14 160 32 21 39 1888 1888
     ...- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f2682fd2f0>
##
              :function (newdata = list(), qr = FALSE)
    ..- attr(*, "srcref")= 'srcref' int [1:8] 161 17 162 56 24 56 1889 1890
    ....- attr(*, "srcfile")=Classes 'srcfilealias', 'srcfile' <environment: 0x55f2682fd2f0>
  - attr(*, "class")= chr "nlsModel"
```

Discussion

Here we will look at some of the issues of using nlsModel. In particular, we will examine how this function may need to be modified to make it easier to maintain and use.

References

Nash, John C. 1979. Compact Numerical Methods for Computers: Linear Algebra and Function Minimisation. Book. Hilger: Bristol.