Package 'nmw'

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Version 0.1.4

Title Understanding Nonlinear Mixed Effects Modeling for Population Pharmacokinetics

Description This shows how NONMEM(R) <http://www.iconplc.com/innovation/nonmem/> software works. NONMEM's classical estimation methods like 'First Order(FO) approximation', 'First Order Conditional Estimation(FOCE)', and 'Laplacian approximation' are explained.

Depends R (>= 3.0.0), numDeriv

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nmw-package *Understanding Nonlinear Mixed Effects Modeling for Population Pharmacokinetics*

Description

This shows how NONMEM(R) <http://www.iconplc.com/innovation/nonmem/> software works.

Details

This package explains 'First Order(FO) approximation' method, 'First Order Conditional Estimation(FOCE)' method, and 'Laplacian(LAPL)' method of NONMEM software.

Author(s)

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References

1. NONMEM Users guide
2. Wang Y. Derivation of various NONMEM estimation methods. J Pharmacokinet Pharmacodyn. 2007.
3. Kang D, Bae K, Houk BE, Savic RM, Karlsson MO. Standard Error of Empirical Bayes Estimate in NONMEM(R) VI. K J Physiol Pharmacol. 2012.
4. Kim M, Yim D, Bae K. R-based reproduction of the estimation process hidden behind NONMEM Part 1: First order approximation method. 2015.
5. Bae K, Yim D. R-based reproduction of the estimation process hidden behind NONMEM Part 2: First order conditional estimation. 2016.

Examples

```
DataAll = Theoph
colnames(DataAll) = c("ID", "BWT", "DOSE", "TIME", "DV")
DataAll[,"ID"] = as.numeric(as.character(DataAll[,"ID"]))

nTheta = 3
nEta = 3
nEps = 2

THETAinit = c(2, 50, 0.1)
OMinit = matrix(c(0.2, 0.1, 0.1, 0.1, 0.2, 0.1, 0.1, 0.1, 0.2), nrow=nEta, ncol=nEta)
SGinit = diag(c(0.1, 0.1))

LB = rep(0, nTheta) # Lower bound
UB = rep(1000000, nTheta) # Upper bound

FGD = deriv(~DOSE/(TH2*exp(ETA2))*TH1*exp(ETA1)/(TH1*exp(ETA1) - TH3*exp(ETA3))*
             (exp(-TH3*exp(ETA3)*TIME)-exp(-TH1*exp(ETA1)*TIME)),
```

```
            c("ETA1","ETA2","ETA3"),
            function.arg=c("TH1", "TH2", "TH3", "ETA1", "ETA2", "ETA3", "DOSE", "TIME"),
            func=TRUE, hessian=TRUE)
H = deriv(~F + F*EPS1 + EPS2, c("EPS1", "EPS2"), function.arg=c("F", "EPS1", "EPS2"), func=TRUE)

PRED = function(THETA, ETA, DATAi)
{
  FGDres = FGD(THETA[1], THETA[2], THETA[3], ETA[1], ETA[2], ETA[3], DOSE=320, DATAi[,"TIME"])
  Gres = attr(FGDres, "gradient")
  Hres = attr(H(FGDres, 0, 0), "gradient")

  if (e$METHOD == "LAPL") {
    Dres = attr(FGDres, "hessian")
    Res = cbind(FGDres, Gres, Hres, Dres[,1,1], Dres[,2,1], Dres[,2,2], Dres[,3,])
   colnames(Res) = c("F", "G1", "G2", "G3", "H1", "H2", "D11", "D21", "D22", "D31", "D32", "D33")
  } else {
    Res = cbind(FGDres, Gres, Hres)
    colnames(Res) = c("F", "G1", "G2", "G3", "H1", "H2")
  }
  return(Res)
}

####### First Order Approximation Method
InitStep(DataAll, THETAinit=THETAinit, OMinit=OMinit, SGinit=SGinit, LB=LB, UB=UB,
         Pred=PRED, METHOD="ZERO")
(EstRes = EstStep())           # 4 sec
(CovRes = CovStep())           # 2 sec
PostHocEta() # Using e$FinalPara from EstStep()
#TabStep()    # Commented out for the CRAN CPU time

######## First Order Conditional Estimation with Interaction Method
#InitStep(DataAll, THETAinit=THETAinit, OMinit=OMinit, SGinit=SGinit, LB=LB, UB=UB,
#         Pred=PRED, METHOD="COND")
#(EstRes = EstStep())           # 2 min
#(CovRes = CovStep())           # 1 min
#get("EBE", envir=e)
#TabStep()

######## Laplacian Approximation with Interacton Method
#InitStep(DataAll, THETAinit=THETAinit, OMinit=OMinit, SGinit=SGinit, LB=LB, UB=UB,
#         Pred=PRED, METHOD="LAPL")
#(EstRes = EstStep())           # 4 min
#(CovRes = CovStep())           # 1 min
#get("EBE", envir=e)
#TabStep()
```

CovStep *Covariance Step*

Description

It calculates standard errors and various variance matrices with the `e$FinalPara` after estimation step.

Usage

```
CovStep()
```

Details

Because `EstStep` uses nonlinear optimization, covariance step is separated from estimation step. It calculates variance-covariance matrix of estimates in the original scale.

Value

`Time`	consumed time
`Standard Error`	standard error of the estimates in the order of theta, omega, and sigma
`Covariance Matrix of Estimates`	covariance matrix of estimates in the order of theta, omega, and sigma. This is inverse(R) x S x inverse(R) by default.
`Correlation Matrix of Estimates`	correlation matrix of estimates in the order of theta, omega, and sigma
`Inverse Covariance Matrix of Estimates`	inverse covariance matrix of estimates in the order of theta, omega, and sigma
`Eigen Values`	eigen values of covariance matrix
`R Matrix`	R matrix of NONMEM, the second derivative of log likelihood function with respect to estimation parameters
`S Matrix`	S matrix of NONMEM, sum of individual cross-product of the first derivative of log likelihood function with respect to estimation parameters

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References

NONMEM Users Guide

See Also

`EstStep`, `InitStep`

Examples

```
# Only after InitStep and EstStep
#CovStep()
```

EstStep *Estimation Step*

Description

This estimates upon the conditions with `InitStep`.

Usage

```
EstStep()
```

Details

It does not have arguments. All necessary arguments are stored in the `e` environment. It assumes "INTERACTION" between eta and epsilon for `"COND"` and `"LAPL"` options. The output is basically same to NONMEM output.

Value

`Initial OFV`	initial value of the objective function
`Time`	time consumed for this step
`Optim`	the raw output from `optim` function
`Final Estimates`	final estimates in the original scale

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References

NONMEM Users Guide

See Also

`InitStep`

Examples

```
# Only After InitStep
#EstStep()
```

`InitStep` *Initialization Step*

Description

It receives parameters for the estimation and stores them into `e` environment.

Usage

```
InitStep(DataAll, THETAinit, OMinit, SGinit, LB, UB, Pred, METHOD)
```

Arguments

`DataAll`	Data for all subjects. It should contain columns which `Pred` function uses.
`THETAinit`	Theta initial values
`OMinit`	Omega matrix initial values
`SGinit`	Sigma matrix initial values
`LB`	Lower bounds for theta vector
`UB`	Upper bounds for theta vector
`Pred`	Prediction function name
`METHOD`	one of the estimation methods `"ZERO"`, `"COND"`, or `"LAPL"`

Details

Prediction function should return not only prediction values(F or IPRED) but also G (first derivative with respect to etas) and H (first derivative of Y with respect to epsilon). For the `"LAPL"`, prediction function should return second derivative with respect to eta also. "INTERACTION" is `TRUE` for `"COND"` and `"LAPL"` option, and `FALSE` for `"ZERO"`. Omega matrix should be full block one. Sigma matrix should be diagonal one.

Value

This does not return values, but stores necessary values into the environment `e`.

Author(s)

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References

NONMEM Users Guide

Examples

```
DataAll = Theoph
colnames(DataAll) = c("ID", "BWT", "DOSE", "TIME", "DV")
DataAll[,"ID"] = as.numeric(as.character(DataAll[,"ID"]))

nTheta = 3
nEta = 3
nEps = 2

THETAinit = c(2, 50, 0.1) # Initial estimate
OMinit = matrix(c(0.2, 0.1, 0.1, 0.1, 0.2, 0.1, 0.1, 0.1, 0.2), nrow=nEta, ncol=nEta)
OMinit
SGinit = diag(c(0.1, 0.1))
SGinit

LB = rep(0, nTheta) # Lower bound
UB = rep(1000000, nTheta) # Upper bound

FGD = deriv(~DOSE/(TH2*exp(ETA2))*TH1*exp(ETA1)/(TH1*exp(ETA1) - TH3*exp(ETA3))*
             (exp(-TH3*exp(ETA3)*TIME)-exp(-TH1*exp(ETA1)*TIME)),
            c("ETA1","ETA2","ETA3"),
            function.arg=c("TH1", "TH2", "TH3", "ETA1", "ETA2", "ETA3", "DOSE", "TIME"),
            func=TRUE, hessian=TRUE)
H = deriv(~F + F*EPS1 + EPS2, c("EPS1", "EPS2"), function.arg=c("F", "EPS1", "EPS2"), func=TRUE)

PRED = function(THETA, ETA, DATAi)
{
  FGDres = FGD(THETA[1], THETA[2], THETA[3], ETA[1], ETA[2], ETA[3], DOSE=320, DATAi[,"TIME"])
  Gres = attr(FGDres, "gradient")
  Hres = attr(H(FGDres, 0, 0), "gradient")

  if (e$METHOD == "LAPL") {
    Dres = attr(FGDres, "hessian")
    Res = cbind(FGDres, Gres, Hres, Dres[,1,1], Dres[,2,1], Dres[,2,2], Dres[,3,])
   colnames(Res) = c("F", "G1", "G2", "G3", "H1", "H2", "D11", "D21", "D22", "D31", "D32", "D33")
  } else {
    Res = cbind(FGDres, Gres, Hres)
    colnames(Res) = c("F", "G1", "G2", "G3", "H1", "H2")
  }
  return(Res)
}

######### First Order Approximation Method
InitStep(DataAll, THETAinit=THETAinit, OMinit=OMinit, SGinit=SGinit, LB=LB, UB=UB,
         Pred=PRED, METHOD="ZERO")

######### First Order Conditional Estimation with Interaction Method
InitStep(DataAll, THETAinit=THETAinit, OMinit=OMinit, SGinit=SGinit, LB=LB, UB=UB,
         Pred=PRED, METHOD="COND")

######### Laplacian Approximation with Interacton Method
InitStep(DataAll, THETAinit=THETAinit, OMinit=OMinit, SGinit=SGinit, LB=LB, UB=UB,
```

```
            Pred=PRED, METHOD="LAPL")
```

`TabStep` *Table Step*

Description

This produces standard table.

Usage

```
TabStep()
```

Details

It does not have arguments. All necessary arguments are stored in the e environment. This is similar to other standard results table.

Value

A table with ID, TIME, DV, PRED, RES, WRES, derivatives of G and H. If the estimation method is other than 'ZERO'(First-order approximation), it includes CWRES, CIPREDI(formerly IPRED), CIRESI(formerly IRES).

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References

NONMEM Users Guide

See Also

`EstStep`

Examples

```
# Only After EstStep
#TabStep()
```

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