

Package ‘ODPR.COVID.19’

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Type Package

Title Prediction region based on over-dispersed Poisson Regression

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Description Prediction Regions in Over-Dispersed Poisson Regression with Applications in Forecasting Number of Deaths during the Covid-19 Pandemic

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ODPR.COVID.19-package *c("\Sexpr[results=rd,stage=build]tools:::Rd_package_title("\#I\"),"ODPR.COVID.19")Prediction region based on over-dispersed Poisson Regression*

Description

c("\Sexpr[results=rd,stage=build]tools:::Rd_package_description("\#I\"),"ODPR.COVID.19")Prediction Regions in Over-Dispersed Poisson Regression with Applications in Forecasting Number of Deaths during the Covid-19 Pandemic

Details

The DESCRIPTION file: `c("\Sexpr[results=rd,stage=build]tools::Rd_package_DESCRIPTION(\"#1\")", "ODPR.COVID.19")\tabular{ll}{ Package: \tab ODPR.COVID.19\cr Type: \tab Package\cr Title: \tab Prediction region based on over-dispersed Poisson Regression\cr Version: \tab 0.9\cr Date: \tab 2020-06-26\cr Author: \tab T. Kim, B. Lieberman, G. Luta, E. Pena\cr Maintainer: \tab T. Kim <yourfault@somewhere.net>\cr Description: \tab Prediction Regions in Over-Dispersed Poisson Regression with Applications in Forecasting Number of Deaths during the Covid-19 Pandemic\cr License: \tab GNU General Public License Version 2\cr RoxygenNote: \tab 7.1.0\cr }`
`c("\Sexpr[results=rd,stage=build]tools::Rd_package_indices(\"#1\")", "ODPR.COVID.19")` Index of help topics: `\preformatted{ AnalysisByCountry2 Analysis by country ByCountryData County data ConvertToList Convert to list NewtRaph Newton-Raphson Method NewtRaphXi Newton-Raphson for Xi ODPR.COVID.19-package c("\Sexpr[results=rd,stage=build]tools::Rd_package_title(\"#1\")", "ODPR.COVID.19")Prediction region based on over-dispersed Poisson Regression OveDisPoiReg Regression part PartialSum Partial Sum PoissonRegOveDis Main Function on Over-dispersed Poisson Regression UHFfuncs UHFfuncs UpdateToday Update today } ~~ An overview of how to use the package, including the ~~ ~~ most important functions ~~`

Author(s)

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AnalysisByCountry2 *Analysis by country*

Description

function for country-wise analysis

Usage

```
AnalysisByCountry2(
  CountryAbbrev = "USA",
  alldata = countrydata,
  fval = 0.14,
  lwdval1 = 5,
  lwdval2 = 3,
  cexval = 0.9,
  topplot = F,
  lowdeaths = 1
)
```

Arguments

CountryAbbrev	Country name
alldata	data
fval	graphical parameter
lwdval1	graphical parameter

lwdval2	graphical parameter
cexval	graphical parameter
toplot	plot or not
lowdeaths	the lowest number for deaths

Details

Okay

Value

list

Examples

```
##---- Should be DIRECTLY executable !! ----
##-- ==> Define data, use random,
##--or do help(data=index) for the standard data sets.

## The function is currently defined as
function (CountryAbbrev = "USA", alldata = countrydata, fval = 0.14,
         lwdval1 = 5, lwdval2 = 3, cexval = 0.9, toplot = F, lowdeaths = 1)
{
  countrycodes = alldata$CountryCode
  ccode = which(countrycodes == CountryAbbrev)
  cdata = alldata$Country_Data[[ccode]]
  CountryCode = as.character(cdata$code)
  CountryID = as.character(cdata$id)
  CountryName = as.character(cdata$name)
  CountryPopn = cdata$popn
  StartDate = as.character(cdata$dateRep[1])
  len = length(cdata$dateRep)
  EndDate = as.character(cdata$dateRep[len])
  ind = which(cdata$cumdeaths >= lowdeaths)
  dateFirstCase = as.character(cdata$dateRep[ind[1]])
  dates = as.character(cdata$dateRep[ind])
  daynum = cdata$dayNum[ind]
  dailycases = cdata$cases[ind]
  dailydeaths = cdata$deaths[ind]
  cumcases = cdata$cumcases[ind]
  cumdeaths = cdata$cumdeaths[ind]
  close.screen(all.screens = T)
  if (toplot) {
    plot(daynum, dailydeaths, type = "l", lwd = lwdval1,
         cex = cexval, xlab = "Day Number", ylab = "Daily Deaths")
    scan()
    plot(daynum, cumdeaths, type = "l", lwd = lwdval1, cex = cexval,
         xlab = "Day Number", ylab = "Cumulative Deaths")
  }
  return(list(CountryCode = CountryCode, CountryID = CountryID,
             CountryName = CountryName, Population = CountryPopn,
             StartDate = StartDate, dateFirstCase = dateFirstCase,
             EndDate = EndDate, DateRep = dates, daynum = daynum,
             dailydeaths = dailydeaths, cumdeaths = cumdeaths))
}
```

ByCountryData

County data

Description

Function to extract county data

Usage

```
ByCountryData(alldat = covid19)
```

Arguments

alldat input data

Details

Okay

Value

list

Author(s)

E. A. Pena

Examples

```
##---- Should be DIRECTLY executable !! ----
##-- ==> Define data, use random,
##--or do help(data=index) for the standard data sets.

## The function is currently defined as
function (alldat = covid19)
{
  uniqueCode = unique(alldat$countryterritoryCode)
  uniqueID = unique(alldat$geoID)
  uniqueCountry = unique(alldat$countriesAndTerritories)
  lenCode = length(uniqueCode)
  Country_Data = vector("list", lenCode)
  n = 0
  for (uc in uniqueCode) {
    n = n + 1
    countrydat = alldat[alldat$countryterritoryCode == uc,
      ]
    temp = ConvertToList(countrydat)
    Country_Data[[n]] = temp
  }
  return(list(CountryCode = uniqueCode, CountryID = uniqueID,
    Country = uniqueCountry, Country_Data = Country_Data))
}
```

```
}
```

 ConvertToList

Convert to list

Description

Function for data conversion

Usage

```
ConvertToList(countrydat)
```

Arguments

countrydat input data

Details

Okay

Value

list

Author(s)

E. A. Pena

Examples

```
##---- Should be DIRECTLY executable !! ----
##-- ==> Define data, use random,
##--or do help(data=index) for the standard data sets.

## The function is currently defined as
function (countrydat)
{
  nrows = dim(countrydat)[1]
  seqrev = nrows:1
  dat = NULL
  dat$code = countrydat[1, 9]
  dat$id = countrydat[1, 8]
  dat$name = countrydat[1, 7]
  dat$popn = countrydat[1, 10]
  dat$dayNum = 1:nrows
  dat$dateRep = countrydat[seqrev, 1]
  dat$day = countrydat[seqrev, 2]
  dat$month = countrydat[seqrev, 3]
  dat$year = countrydat[seqrev, 4]
  dat$cases = countrydat[seqrev, 5]
  dat$deaths = countrydat[seqrev, 6]
```

```

    dat$cumcases = PartialSum(dat$cases)
    dat$cumdeaths = PartialSum(dat$deaths)
    return(dat)
}

```

NewtRaph

Newton-Raphson Method

Description

Function for Newton-Raphson method

Usage

```
NewtRaph(thseed, xiseed, Y, X, tol = 10-5)
```

Arguments

thseed	Initial value for theta
xiseed	Initial value for xi
Y	data
X	data
tol	approximation tolerance

Details

Okay

Value

list

Author(s)

E. A. Pena

Examples

```

##---- Should be DIRECTLY executable !! ----
##-- ==> Define data, use random,
##--or do help(data=index) for the standard data sets.

## The function is currently defined as
function (thseed, xiseed, Y, X, tol = 10-5)
{
  p = length(thseed)
  kiter = 0
  th0 = thseed
  xi0 = xiseed
  OK = FALSE

```

```

while (!OK) {
  kiter = kiter + 1
  est0 = c(th0, xi0)
  out = UHFuncs(th0, xi0, Y, X)
  U = out$U
  H = out$H
  UUt = out$UUt
  Hinv = solve(H)
  est1 = est0 - Hinv %*% U
  th0 = est1[-(p + 1)]
  xi0 = est1[(p + 1)]
  dist = sqrt(sum((est1 - est0)^2))
  if (dist < tol) {
    OK = TRUE
  }
}
XiCov = Hinv %*% UUt %*% t(Hinv)
return(list(kiter = kiter, th = th0, xi = xi0, U = U, H = H,
  Hinv = Hinv, UUt = UUt, XiCov = XiCov))
}

```

NewtRaphXi

*Newton-Raphson for Xi***Description**

Function for Newton-Raphson method for xi

Usage

```
NewtRaphXi(xiseed, theta, Y, X, tol = 10^(-5))
```

Arguments

xiseed	Initial value
theta	theta
Y	data
X	data
tol	approximation tolerance

Details

Okay

Value

list

Author(s)

E. A. Pena

Examples

```
##---- Should be DIRECTLY executable !! ----
##-- ==> Define data, use random,
##--or do help(data=index) for the standard data sets.

## The function is currently defined as
function (xiseed, theta, Y, X, tol = 10^(-5))
{
  rho = exp(X %*% theta)
  n = length(Y)
  kiter = 0
  OK = FALSE
  xi0 = xiseed
  while (!OK) {
    kiter = kiter + 1
    g = sum((Y - rho)^2 - rho * (1 + (1 + rho)/xi0))
    gp = sum(rho * (1 + rho))/xi0^2
    xi1 = xi0 - g/gp
    if (abs(xi1 - xi0) < tol) {
      OK = TRUE
    }
    xi0 = xi1
    if (xi1 < 0) {
      OK = FALSE
      xiseed = xiseed/2
      xi0 = xiseed
      kiter = 0
    }
  }
  return(list(kiter = kiter, xi = xi1))
}
```

OveDisPoiReg

Regression part

Description

Function handles the regression part

Usage

```
OveDisPoiReg(Y, X, X0 = NULL, xival = NULL, alpha = 0.05, tol = 10^(-5))
```

Arguments

Y	data
X	data
X0	prediction
xival	over-dispersion parameter, xi
alpha	alpha
tol	approximation tolerance

Details

Okay

Value

list

Author(s)

E. A. Pena

Examples

```
##---- Should be DIRECTLY executable !! ----
##-- ==> Define data, use random,
##--or do help(data=index) for the standard data sets.

## The function is currently defined as
function (Y, X, X0 = NULL, xival = NULL, alpha = 0.05, tol = 10^(-5))
{
  p = dim(X)[2]
  n = dim(X)[1]
  if (is.null(X0)) {
    X0 = X
  }
  m = dim(X0)[1]
  Xmean = apply(X, 2, "mean")
  Xstd = apply(X, 2, "sd")
  XS = X
  X0S = X0
  for (j in 2:p) {
    XS[, j] = (X[, j] - Xmean[j])/Xstd[j]
    X0S[, j] = (X0[, j] - Xmean[j])/Xstd[j]
  }
  outglm = glm(Y ~ XS[, -1], family = poisson(link = log))
  outglmsumm = summary(outglm)
  theta = outglm$coefficients
  if (is.null(xival)) {
    xi = NewtRaphXi(1, theta, Y, XS, tol)$xi
  }
  else {
    xi = Inf
  }
  XiCov = NewtRaph(theta, xi, Y, XS, tol)$XiCov
  XiCov11 = XiCov[1:p, 1:p]
  rho0 = exp(X0S %*% theta)
  zcrit = qnorm(1 - alpha/2)
  PE = rep(0, m)
  PE2 = rep(0, m)
  for (i in 1:m) {
    PE[i] = zcrit * sqrt(rho0[i] + rho0[i] * (1 + rho0[i])/xi +
      (1/n) * (rho0[i]^2) * (t(X0S[i, ]) %*% XiCov11) %*%
      X0S[i, ])
  }
  PILow = rho0 - PE
}
```

```

    PIHig = rho0 + PE
    for (i in 1:m) {
        PILow[i] = max(0, PILow[i])
    }
    return(list(outglm = outglm, outglmsumm = outglmsumm, theta = theta,
               xi = xi, XiCov = XiCov, Xmean = Xmean, Xstd = Xstd, FitPred = data.frame(rho0,
               PILow, PIHig, X0)))
}

```

PartialSum

Partial Sum

Description

Function for data partial summation

Usage

PartialSum(x)

Arguments

x data

Details

Okay

Value

list

Author(s)

E. A. Pena

Examples

```

##---- Should be DIRECTLY executable !! ----
##-- ==> Define data, use random,
##--or do help(data=index) for the standard data sets.

## The function is currently defined as
function (x)
{
    nlen = length(x)
    y = rep(0, nlen)
    for (i in 1:nlen) {
        y[i] = sum(x[1:i])
    }
    return(y)
}

```

PoissonRegOveDis

Main Function on Over-dispersed Poisson Regression

Description

This is the main file which incorporates other functions.

Usage

```
PoissonRegOveDis(
  daycutpred = 137,
  maxday = 154,
  ordfit = 5,
  DayEffect = TRUE,
  Country = "USA",
  xival = NULL,
  dat = NULL,
  alpha = 0.05,
  yhighval = NULL,
  targetval = 1e+05,
  LegPos = c("topright", "left"),
  ToPlot = TRUE
)
```

Arguments

daycutpred	threshold for prediction
maxday	maximum day for the prediction
ordfit	the order of polynomial of Poisson regression
DayEffect	day effect
Country	country name
xival	over-dispersion parameter, xi
dat	data
alpha	alpha
yhighval	graphical parameter
targetval	graphical parameter
LegPos	graphical parameter
ToPlot	plot or not

Details

Okay

Value

list

Author(s)

E. A. Pena

Examples

```

##---- Should be DIRECTLY executable !! ----
##-- ==> Define data, use random,
##--or do help(data=index) for the standard data sets.

## The function is currently defined as
function (daycutpred = 137, maxday = 154, ordfit = 5, DayEffect = TRUE,
        Country = "USA", xival = NULL, dat = NULL, alpha = 0.05,
        yhighval = NULL, targetval = 1e+05, LegPos = c("topright",
        "left"), ToPlot = TRUE)
{
  if (is.null(dat)) {
    countrydata = UpdateToday()
  }
  else {
    countrydata = dat
  }
  dat = AnalysisByCountry2(Country, alldata = countrydata)
  daynum = dat$daynum
  deaths = dat$dailydeaths
  cumdeaths = dat$cumdeaths
  DateRep = dat$DateRep
  close.screen(all.screens = T)
  daynumc = daynum - daynum[1]
  X = NULL
  collab = NULL
  for (j in 0:ordfit) {
    X = cbind(X, daynumc^j)
    collab = c(collab, paste("DayNum", j))
  }
  colnames(X) = collab
  if (DayEffect) {
    dayclass = daynum%%7
    dayclass = factor(dayclass, levels = as.character(0:6),
      labels = c("Monday", "Tuesday", "Wednesday", "Thursday",
      "Friday", "Saturday", "Sunday"))
    ll = length(dayclass)
    desmat = model.matrix(~dayclass)[, -1]
    daylab = c("Tuesday", "Wednesday", "Thursday", "Friday",
      "Saturday", "Sunday")
    X = cbind(X, desmat)
    colnames(X) = c(collab, daylab)
  }
  inpred = (daynum <= daycutpred)
  numdaysused = sum(inpred)
  Y = deaths[inpred]
  X = X[inpred, ]
  X0 = NULL
  dayspred = daynum[1]:maxday
  dayspredc = dayspred - daynum[1]
  for (j in 0:ordfit) {

```

```

    X0 = cbind(X0, dayspredc^j)
  }
  if (DayEffect) {
    dayspredclass = as.factor(dayspred%%7)
    dayspredclass = factor(dayspredclass, levels = 0:6, labels = c("Monday",
      "Tuesday", "Wednesday", "Thursday", "Friday", "Saturday",
      "Sunday"))
    ll = length(dayspredclass)
    desmat = model.matrix(~dayspredclass)[, -1]
    X0 = cbind(X0, desmat)
  }
  numdaystopred = maxday - daycutpred
  if (numdaystopred == 0) {
    alphaeff = alpha
  }
  else {
    alphaeff = 1 - (1 - alpha)^(1/numdaystopred)
  }
  out = OveDisPoiReg(Y, X, X0, alpha = alphaeff, xival = xival)
  outglm = out$outglm
  outglmsumm = out$outglmsumm
  thetahat = out$theta
  xihat = out$xi
  XiCov = out$XiCov
  Xmean = out$Xmean
  Xstd = out$Xstd
  FitPred = out$FitPred[, 1:3]
  if (is.null(yhighval)) {
    yhighval = max(c(deaths, FitPred[, 3]))
  }
  if (ToPlot) {
    plot(NULL, NULL, xlim = c(daynum[1], maxday), ylim = c(0,
      yhighval), xlab = "Day Number Since 12/31/2019",
      ylab = "Daily Deaths", main = paste("Daily Deaths due to Covid-19 in ",
      Country))
    points(daynum[inpred], Y, col = "black", lwd = 3)
    matlines(dayspred, FitPred, col = c("blue", rep("red",
      2)), lty = 1, pch = 1, lwd = 3)
    points(daynum[(!inpred) & (daynum <= maxday)], deaths[(!inpred) &
      (daynum <= maxday)], col = "red", lwd = 3)
    abline(v = daycutpred, col = "black", lwd = 2)
    abline(v = maxday, col = "green", lwd = 2)
  }
  lendayspred = length(dayspred)
  cumdeathspred = rep(0, lendayspred)
  cumdeathspredlow = rep(0, lendayspred)
  cumdeathspredhig = rep(0, lendayspred)
  for (i in 1:lendayspred) {
    cumdeathspred[i] = sum(FitPred[1:i, 1])
    cumdeathspredlow[i] = sum(FitPred[1:i, 2])
    cumdeathspredhig[i] = sum(FitPred[1:i, 3])
  }
  if (daycutpred < maxday) {
    daysahead = (daycutpred + 1):maxday
    lendaysahead = length(daysahead)
    lennow = length(daynum[daynum <= daycutpred])
    currentval = cumdeaths[lennow]

```

```

cumdeathspredahead = rep(currentval, lendaysahead)
cumdeathspredaheadlow = rep(currentval, lendaysahead)
cumdeathspredaheadhig = rep(currentval, lendaysahead)
for (i in 1:lendaysahead) {
  cumdeathspredahead[i] = cumdeathspredahead[i] + sum(FitPred[(lennow +
    1):(lennow + i), 1])
  cumdeathspredaheadlow[i] = cumdeathspredaheadlow[i] +
    sum(FitPred[(lennow + 1):(lennow + i), 2])
  cumdeathspredaheadhig[i] = cumdeathspredaheadhig[i] +
    sum(FitPred[(lennow + 1):(lennow + i), 3])
}
maxy = max(cumdeathspredaheadhig)
}
else {
  maxy = max(cumdeaths[inpred])
}
if (ToPlot) {
  scan()
  plot(NULL, NULL, xlim = range(dayspred), ylim = c(0,
    maxy), xlab = "Day Number Since 12/31/2019", ylab = "Cumulative Deaths",
    main = paste("Cumulative Deaths Due to Covid-19 in ",
      Country))
  lines(dayspred, cumdeathspred, type = "l", col = c("blue"),
    lty = 1, pch = 1, lwd = 3)
  points(daynum[inpred], cumdeaths[inpred], col = "black",
    lwd = 3)
  points(daynum[(!inpred) & (daynum <= maxday)], cumdeaths[(!inpred) &
    (daynum <= maxday)], col = "red", lwd = 3)
  if (daycutpred < maxday) {
    matlines(daysahead, cbind(cumdeathspredaheadlow,
      cumdeathspredaheadhig), col = "magenta", lty = 1,
      pch = 2, lwd = 3)
  }
  abline(v = daycutpred, col = "black", lwd = 2)
  abline(v = maxday, col = "green", lwd = 2)
}
summpreds = NULL
if (daycutpred < maxday) {
  summpreds = data.frame(daynum = daysahead, Pred = cumdeathspredahead,
    PILow = cumdeathspredaheadlow, PIHig = cumdeathspredaheadhig)
}
return(list(Country = Country, dat = dat, outglm = outglm,
  outglmsumm = outglmsumm, daycutpred = daycutpred, numdaysused = numdaysused,
  maxday = maxday, numdaystopred = numdaystopred, ordfit = ordfit,
  alpha = alpha, alphaeff = alphaeff, thetahat = thetahat,
  xihat = xihat, XiCov = XiCov, Xmean = Xmean, Xstd = Xstd,
  summpreds = summpreds))
}

```

UHFuncs

UHFuncs

Description

Estimation

Usage

```
UHFunks(th, xi, Y, X)
```

Arguments

th	parameter1
xi	target parameter
Y	data
X	data

Details

Okay

Value

list

Author(s)

E. A. Pena

Examples

```
##---- Should be DIRECTLY executable !! ----
##-- ==> Define data, use random,
##--or do help(data=index) for the standard data sets.

## The function is currently defined as
function (th, xi, Y, X)
{
  p = length(th)
  n = length(Y)
  U1 = rep(0, p)
  U2 = 0
  UUt = matrix(0, (p + 1), (p + 1))
  H11 = matrix(0, p, p)
  H12 = matrix(0, p, 1)
  H21 = matrix(0, 1, p)
  H22 = 0
  for (i in 1:n) {
    xtemp = as.vector(X[i, ])
    ytemp = Y[i]
    rho = as.numeric(exp(t(xtemp) %*% th))
    u1add = xtemp * (ytemp - rho)
    u2add = (ytemp - rho)^2 - rho * (1 + (1 + rho)/xi)
    u12add = c(u1add, u2add)
    U1 = U1 + u1add
    U2 = U2 + u2add
    UUt = UUt + u12add %*% t(u12add)
    H11 = H11 - (xtemp %*% t(xtemp)) * rho
    H21 = H21 - xtemp * rho * (2 * (ytemp - rho) + (1 + (1 +
      rho)/xi) - rho/xi^2)
    H22 = H22 + (1/xi^2) * rho * (1 + rho)
  }
}
```

```

    }
    U = c(U1, U2)/n
    H = rbind(cbind(H11, H12), cbind(H21, H22))/n
    UUt = UUt/n
    return(list(U = U, H = H, UUt = UUt))
  }

```

UpdateToday

Update today

Description

function for date updating

Usage

```
UpdateToday()
```

Details

Okay

Value

list

Note

function for data updating

Author(s)

E. A. Pena

References

No particular reference

See Also

###

Examples

```

##---- Should be DIRECTLY executable !! ----
##-- ==> Define data, use random,
##--or do help(data=index) for the standard data sets.

## The function is currently defined as
function ()
{
  library(utils)

```



```
library(httr)
GET("https://opendata.ecdc.europa.eu/covid19/casedistribution/csv",
    authenticate(":", ":", type = "ntlm"), write_disk(tf <- tempfile(fileext = ".csv")))
covid19 <- read.csv(tf)
countrydata = ByCountryData(covid19)
return(countrydata)
}
```

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