# Package 'dyads’ 

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Type Package
Title Dyadic Network Analysis
Version 1.2.1
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Depends R (>=3.0.0)
Imports stats, CholWishart, MASS, RcppZiggurat, Rfast, mvtnorm
Suggests plyr
Description Contains functions for the MCMC simulation of dyadic network models j2 (Zijlstra, 2017, [doi:10.1080/0022250X.2017.1387858](doi:10.1080/0022250X.2017.1387858)) and p2 (Van Duijn, Snijders \& Zijlstra, 2004, [doi:10.1046/j.0039-0402.2003.00258.x](doi:10.1046/j.0039-0402.2003.00258.x)), the multilevel p2 model (Zijlstra, Van Duijn \& Snijders (2009) [doi:10.1348/000711007X255336](doi:10.1348/000711007X255336)), and the bidirectional (multilevel) counterpart of the the multilevel p2 model as described in Zijlstra, Van Duijn \& Snijders (2009) [doi:10.1348/000711007X255336](doi:10.1348/000711007X255336), the (multilevel) b2 model.
License GPL (>= 2)

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```
dyads-package dyads
```


## Description

Package for Dyadic Network Analysis.

## Details

| Package: | dyads |
| :--- | :--- |
| Type: | Package |
| Title: | Dyadic Network Analysis |
| Version: | 1.2 .1 |
| Date: | $2022-08-16$ |
| Author: | Bonne J.H. Zijlstra [B.J.H.Zijlstra@uva.nl](mailto:B.J.H.Zijlstra@uva.nl) |
| Maintainer: | Bonne J.H. Zijlstra [B.J.H.Zijlstra@uva.nl](mailto:B.J.H.Zijlstra@uva.nl) |
| Depends: | R (>=3.0.0) |
| Imports: | stats, CholWishart, MASS, RcppZiggurat, Rfast, mvtnorm |
| Suggests: | plyr |
| Description: | Contains functions for the MCMC simulation of dyadic network models j2 (Zijlstra, 2017, <doi:10.1080/00222 |
| License: | GPL $(>=2)$ |

Index of help topics:

```
b2ML MCMC estimates for the (multilevel) b2 model
dyads-package dyads
j2 MCMC estimates for the j2 model
p2 MCMC estimates for the p2 model
p2ML MCMC estimates for the (multilevel) p2 model
```

Includes functions for estimation of the (multilevel) p2 model (van Duijn, Snijders and Zijlstra (2004) [doi:10.1046/j.0039-0402.2003.00258.x](doi:10.1046/j.0039-0402.2003.00258.x)), more specifically the adaptive random walk algorithm (Zijlstra, van Duijn and Snijders (2009) [doi:10.1348/000711007X255336](doi:10.1348/000711007X255336)), for the estimation of the j 2 model (Zijlstra (2017) [doi:10.1080/0022250X.2017.1387858](doi:10.1080/0022250X.2017.1387858)), and for their bidirectional counterpart, b2.

## Author(s)

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## References

Zijlstra, B.J.H., Duijn, M.A.J. van, and Snijders, T.A.B. (2009). MCMC estimation for the \$p_2\$ network regression model with crossed random effects. British Journal of Mathematical and Statistical Psychology, 62, 143-166. Zijlstra, B.J.H. (2017). Regression of directed graphs on independent effects for density and reciprocity. Journal of Mathematical Sociology, 41(4), 185-192.

## Examples

```
# create a very small network with covariates for illustrative purposes
S <- c(1,0,1,0,1,1,0,1,0,1)
REC <- (S*-1)+1
D1 <- matrix(c(0,1,0,1,0,1,0,1,0,1,
                0,0,0,1,0,1,0,1,0,1,
                1,1,0,0,1,0,0,0,0,0,
                1,1,1,0,1,0,0,0,0,1,
                1,0,1,0,0,1,1,0,1,0,
                0,0,0,0,0,0,1,1,1,1,
                0,0,0,0,0,1,0,1,0,1,
                1,0,0,0,0,1,1,0,1,1,
                0,1,0,1,0,1,0,1,0,0,
                1,0,1,1,1,0,0,0,0,0), ncol=10)
D2 <- abs(matrix(rep(S,10), byrow = FALSE, ncol= 10) -
            matrix(rep(REC,10), byrow = TRUE, ncol= 10))
R <- D1*t(D1)
Y <- matrix(c(0,1,1,1,1,1,0,0,1,1,
                    0,0,0,1,1,1,0,0,1,0,
                    1,1,0,1,1,1,0,0,1,1,
            1,1,1,0,1,1,0,1,1,0,
            1,1,1,1,0,1,1,0,1,1,
            0,1,1,1,1,0,1,1,1,0,
            1,0,1,0,1,1,0,1,0,1,
            0,1,1,1,0,1,1,0,1,1,
            1,0,1,0,1,0,1,1,0,1,
            1,1,1,0,0,1,1,1,1,0), ncol=10)
# estimate p2 model
p2(Y, sender= ~ S, receiver = ~ REC, density = ~ D1 + D2, reciprocity= ~ R,
    burnin = 100, sample = 400, adapt = 10)
# Notice: burn-in, sample size and number of adaptive sequenses are
# much smaller than recommended to keep computation time low.
# recommended code:
## Not run:
p2(Y,sender= ~ S, receiver = ~ REC, density = ~ D1 + D2, reciprocity= ~ R)
## End(Not run)
```


## Description

Estimates the (multilevel) b2 model parameters, which is the bidirectional counterpart of the multilevel p2 model as described in Zijlstra, Van Duijn and Snijders (2006) <doi: 10.1027/16142241.2.1.42>.

## Usage

b2ML(nets, actor $=$ NULL, density $=$ NULL, adapt $=$ NULL, burnin $=$ NULL, center $=$ NULL, separate= NULL, densVar = NULL, seed = NULL)

## Arguments

nets List with n dichotomous symmetric dependent networks.
actor Optional matrix with a stacked actor covariate, corresponding to the n networks. Multiple actor covariates can be added as a formula object, see example below
density Optional matrix with symmetric a stacked density covariate, with dimensions similar to the n dependent networks. Multiple density covariates can be added as a formula object, see example below
adapt Optional number of adaptive sequenses (default is 100 ).
burnin Optional specification of number of burn-in iterations (default is 5000).
center Optional argument for centering predictors (default is TRUE).
separate Optional argument for estimating separate coefficients for the n dependent networks (default is FALSE).
densVar Optional argument for estimating densty variance at the network level (default is TRUE).
seed $\quad$ Optonal specification of random seed (delfault is 1).

## Value

Returns a fitted model of class b2ML, to be opened with the function summary().

## Author(s)

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## References

Zijlstra, B. J., Van Duijn, M. A., \& Snijders, T. A. (2006). The Multilevel p2 Model A random effects model for the analysis of multiple social networks. Methodology: European Journal of Research Methods for the Behavioral and Social Sciences, 2(1), 42.

## Examples

```
# create two very small networks with covariates for illustrative purposes
Y1 <- matrix(c( 0, 1, 1, 1, 1, 1, 1, 1, 1,0,
    1,0,1,0,1,1,1,1,1,1,
    1,1,0,0,1,1,1,1,0,1,
    1,0,0,0,1,0,0,1,0,0,
    1,1,1,1,0,1,1,0,1,1,
    1,1,1,0,1,0,1,0,1,1,
    1,1,1,0,1,1,0,1,1,1,
    1,1,1,1,0,0,1,0,0,1,
```

```
    1,1,0,0,1,1,1,0,0,1,
    0,1,1,0,1,1,1,1,1,0), ncol=10)
Y2 <- matrix(c( 0,0,1,0,1,1,0,1,0,0,
    0,0,0,0,0,0,0,1,1,0,
    1,0,0,1,0,1,0,1,0,0,
    0,0,1,0,0,0,1,1,0,0,
    1,0,0,0,0,0,1,1,0,0,
    1,0,1,0,0,0,1,1,0,0,
    0,0,0,1,1,1,0,1,0,0,
    1,1,1,1,1,1,1,0,0,1,
    0,1,0,0,0,0,0,0,0,0,
    0,0,0,0,0,0,0,1,0,0), ncol=10)
Y <- list(Y1, Y2)
Aa1 <- c(1,0,1,0,1,1,0,1,0,1)
Aa2 <- c(1,0,0,1,0,0,1,1,0,1)
Aa <- list(Aa1, Aa2)
Aat <- do.call(plyr::rbind.fill.matrix, Aa)
Ab1 <- c(0,0,0,0,0,0,0,0,0,0)
Ab2 <- c(1, 1, 1, 1,1,1,1,1,1,1)
Ab <- list(Ab1, Ab2)
Abt <- do.call(plyr::rbind.fill.matrix, Ab)
Da1 <- abs(matrix(rep(Aa1,10), byrow = FALSE, ncol= 10) -
    matrix(rep(Aa1,10), byrow = TRUE, ncol= 10))
Da2 <- abs(matrix(rep(Aa2,10), byrow = FALSE, ncol= 10) -
    matrix(rep(Aa2,10), byrow = TRUE, ncol= 10))
Da <- list(Da1, Da2)
Dat <- do.call(plyr::rbind.fill.matrix, Da)
# estimate b2 model for two networks
M1 <- b2ML(Y,actor= ~ Aat + Abt, density = ~ Dat, adapt = 10, burnin = 100, densVar = FALSE)
summary(M1)
# Notice: burn-in, and number of adaptive sequenses are
# much smaller than recommended to keep computation time low.
# recommended code:
## Not run:
M1 <- b2ML(Y,actor= ~ Aat + Abt, density = ~ Dat, densVar = FALSE)
summary(M1)
## End(Not run)
# estimate b2 model for a single network
M2 <- b2ML(list(Y[[1]]),actor= ~ Aat[1:10,], density = ~ Dat[1:10,], adapt = 10, burnin = 100,
densVar = FALSE)
summary(M2)
# Notice: burn-in, and number of adaptive sequenses are
# much smaller than recommended to keep computation time low.
# recommended code:
## Not run:
M2 <- b2ML(list(Y[[1]]),actor= ~ Aat[1:10,], density = ~ Dat[1:10,], densVar = FALSE)
summary(M2)
## End(Not run)
```

j2 MCMC estimates for the j2 model

## Description

Estimates j2 model parameters as described in Zijlstra (2017) [doi:10.1080/0022250X.2017.1387858](doi:10.1080/0022250X.2017.1387858).

## Usage

j2(net, sender $=$ NULL, receiver $=$ NULL , density $=$ NULL, reciprocity $=$ NULL, burnin $=$ NULL, sample $=$ NULL, adapt= NULL, center $=$ NULL, seed $=$ NULL)

## Arguments

| net | Directed dichotomous $n * n$ network (digraph). |
| :--- | :--- |
| sender | Optional sender covariates of lenght n. |
| receiver | Optinal receiver covariates of length n. |
| density | Optional density covariates of dimensions $n * \mathrm{n}$. |
| reciprocity | Optional symmetric reciprocity covariates of dimensions $\mathrm{n} * \mathrm{n}$. |
| burnin | Optional specification of number of burn-in iterations (default is 10000). |
| sample | Optional specification of number of MCMC samples (default is 40000). |
| adapt | Optional number of adaptive sequenses (default is 100). |
| center | Optional boolean argument for centering predictors (default is TRUE). |
| seed | Optonal specification of random seed (delfault is 1 ). |

## Value

Returns a matrix with MCMC means, standard deviations, quantiles and effective sample sizes for j2 parameters.

## Author(s)

Bonne J.H. Zijlstra [b.j.h.zijlstra@uva.nl](mailto:b.j.h.zijlstra@uva.nl)

## References

Zijlstra, B.J.H. (2017). Regression of directed graphs on independent effects for density and reciprocity. The Journal of Mathematical Sociology 41 (4).

## Examples

```
# create a very small network with covariates for illustrative purposes
S <- c(1,0,1,0,1,1,0,1,0,1)
REC <- c(0,0,1,1,0,0,1,1,0,0)
D1 <- matrix(c(0, 1,0,1,0,1,0,1,0,0,
                    0,0,1,1,0,1,0,1,0,1,
                    1,1,0,0,1,0,0,0,0,0,
                    1,1,1,0,1,0,0,0,0,1,
                    1,0,1,0,0,1,1,0,1,1,
                    0,0,0,0,0,0,1,1,1,1,
                    0,0,0,0,0,1,0,1,0,1,
                    1,0,0,0,0,1,1,0,1,1,
                    0,1,0,1,0,1,0,1,0,0,
                            0,0,1,1,1,0,0,0,0,0), ncol=10)
D2 <- abs(matrix(rep(S,10), byrow = FALSE, ncol= 10) -
            matrix(rep(REC,10), byrow = TRUE, ncol= 10))
R <- D1*t(D1)
Y <- matrix(c(0,0,1,1,1,1,0,0,1,1,
                    0,0,0,1,1,1,0,0,1,0,
                    1,1,0,1,1,1,0,0,1,1,
                    0,1,1,0,1,1,0,1,1,0,
                    1,1,1,1,0,1,1,0,1,1,
            0,1,1,1,1,0,1,1,1,0,
            1,0,1,0,1,1,0,1,0,1,
            0,1,1,1,0,1,1,0,1,1,
            1,0,1,0,1,0,1,1,0,1,
            1,1,1,0,0,1,1,1,1,0), ncol=10)
# estimate j2 model
j2(Y, sender= ~ S, receiver = ~ REC, density = ~ D1 + D2, reciprocity= ~ R,
    burnin = 100, sample = 400, adapt = 10)
# notice: burn-in, sample size and number of adaptive sequenses are
# much smaller than recommended to keep computation time low.
# recommended code:
## Not run:
j2(Y,sender= ~ S, receiver = ~ REC, density = ~ D1 + D2, reciprocity= ~ R)
## End(Not run)
```

    p2
    MCMC estimates for the p2 model
    
## Description

Estimates p2 model parameters with the adaptive random walk algorithm as described in Zijlstra, Van Duijn and Snijders (2009) <doi: 10.1348/000711007X255336>.

## Usage

p2(net, sender $=$ NULL, receiver $=$ NULL, density $=$ NULL, reciprocity $=$ NULL,
burnin $=$ NULL, sample $=$ NULL, adapt $=$ NULL, seed $=$ NULL)

## Arguments

| net | Directed dichotomous $n * n$ network (digraph). |
| :--- | :--- |
| sender | Optional sender covariates of lenght $n$. |
| receiver | Optinal receiver covariates of length $n$. |
| density | Optional density covariates of dimensions $n * n$. |
| reciprocity | Optional symmetric reciprocity covariates of dimensions $n * n$. |
| burnin | Optional specification of number of burn-in iterations (default is 10000). |
| sample | Optional specification of number of MCMC samples (default is 40000). |
| adapt | Optional number of adaptive sequenses (default is 100). |
| seed | Optonal specification of random seed (delfault is 1 ). |

## Value

Returns a matrix with MCMC means, standard deviations, quantiles and estimated effective sample sizes for p2 parameters.

## Author(s)

Bonne J.H. Zijlstra [b.j.h.zijlstra@uva.nl](mailto:b.j.h.zijlstra@uva.nl)

## References

Zijlstra, B.J.H., Duijn, M.A.J. van, and Snijders, T.A.B. (2009). MCMC estimation for the \$p_2\$ network regression model with crossed random effects. British Journal of Mathematical and Statistical Psychology, 62, 143-166.

## Examples

```
# create a very small network with covariates for illustrative purposes
S <- c(1,0,1,0,1,1,0,1,0,1)
REC <- (S*-1)+1
D1 <- matrix(c(0,1,0,1,0,1,0,1,0,1,
    0,0,0,1,0,1,0,1,0,1,
    1,1,0,0,1,0,0,0,0,0,
    1,1,1,0,1,0,0,0,0,1,
    1,0,1,0,0,1,1,0,1,0,
    0,0,0,0,0,0,1,1,1,1,
    0,0,0,0,0,1,0,1,0,1,
    1,0,0,0,0,1,1,0,1,1,
    0,1,0,1,0,1,0,1,0,0,
    1,0,1,1,1,0,0,0,0,0), ncol=10)
D2 <- abs(matrix(rep(S,10), byrow = FALSE, ncol= 10) -
```

```
            matrix(rep(REC,10), byrow = TRUE, ncol= 10))
    R<- D1*t(D1)
    Y <- matrix(c(0,1,1,1,1,1,0,0,1,1,
        0,0,0,1,1,1,0,0,1,0,
        1,1,0,1,1,1,0,0,1,1,
        1,1,1,0,1,1,0,1,1,0,
        1,1,1,1,0,1,1,0,1,1,
        0,1,1,1,1,0,1,1,1,0,
        1,0,1,0,1,1,0,1,0,1,
        0,1,1,1,0,1,1,0,1,1,
        1,0,1,0,1,0,1,1,0,1,
        1,1,1,0,0,1,1,1,1,0), ncol=10)
    # estimate p2 model
    p2(Y,sender= ~ S, receiver = ~ REC, density = ~ D1 + D2, reciprocity= ~ R,
        burnin = 100, sample = 400, adapt = 10)
    # Notice: burn-in, sample size and number of adaptive sequenses are
    # much smaller than recommended to keep computation time low.
    # recommended code:
    ## Not run:
    p2(Y, sender= ~ S, receiver = ~ REC, density = ~ D1+ D2, reciprocity= ~ R)
    ## End(Not run)
```

p2ML

MCMC estimates for the (multilevel) p 2 model

## Description

Estimates the (multilevel) p2 model parameters, as described in Zijlstra, Van Duijn and Snijders (2006) <doi: 10.1027/1614-2241.2.1.42>.

## Usage

p2ML(nets, sender $=$ NULL, receiver $=$ NULL, density $=\sim$ 1, reciprocity $=\sim 1$,
adapt $=$ NULL, burnin $=$ NULL, center $=$ NULL, separate $=$ NULL, seed $=$ NULL)

## Arguments

| nets | List with $n$ dichotomous dependent directed networks. <br> sender |
| :--- | :--- |
| Optional matrix with a stacked actor-level sender covariate, corresponding to <br> the $n$ networks. Multiple sender covariates can be added as a formula object, see <br> example below |  |
| receiver | Optional matrix with a stacked actor-level receiver covariate, corresponding to <br> the n networks. Multiple receiver covariates can be added as a formula object |
| density | Optional stacked matrix with a density covariate, with dimensions similar to the <br> n dependent networks. Multiple density covariates can be added as a formula <br> object, see example below |


| reciprocity | Optional stacked matrix with a symmetric reciprocity covariate, with dimen- <br> sions similar to the $n$ dependent networks. Multiple reciprocity covariates can <br> be added as a formula object |
| :--- | :--- |
| adapt | Optional number of adaptive sequenses (default is 125). |
| burnin | Optional specification of number of burn-in iterations (default is 2500). <br> center |
| Optional argument for centering predictors (default is TRUE). |  |
| separate | Optional argument for estimating separate coefficients for the n dependent net- <br> works (default is FALSE). |
| seed | Optonal specification of random seed (delfault is 1). |

## Value

Returns a fitted model of class 2ML, to be opened with the function summary().

## Author(s)

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## References

Zijlstra, B. J., Van Duijn, M. A., \& Snijders, T. A. (2006). The Multilevel p2 Model A random effects model for the analysis of multiple social networks. Methodology: European Journal of Research Methods for the Behavioral and Social Sciences, 2(1), 42.

## Examples

```
# create two very small networks with covariates for illustrative purposes
Y1 <- matrix(c(0,1,0,1,0,1,0,1,0,0,
    0,0,1,1,0,1,0,1,0,1,
    1,1,0,0,1,0,0,0,0,0,
    1,1,1,0,1,0,0,0,0,1,
    1,0,1,0,0,1,1,0,1,1,
    0,0,0,0,0,0,1,1,1,1,
    0,0,0,0,0,1,0,1,0,1,
    1,0,0,0,0,1,1,0,1,1,
    0,1,0,1,0,1,0,1,0,0,
    0,0,1,1,1,0,0,0,0,0), ncol=10)
Y2 <- matrix(c(0, 0, 1, 0, 1, 0, 0, 1,0,0,
    0,0,0,0,0,0,0,1,1,0,
    0,0,0,1,0,1,0,1,0,1,
    0,0,1,0,0,0,1,1,0,0,
    1,0,0,1,0,0,1,0,0,1,
    0,0,1,0,0,0,1,1,0,0,
    0,1,0,0,1,0,0,0,0,0,
    1,0,1,0,1,1,1,0,0,1,
    0,1,0,1,0,0,0,0,0,0,
    0,1,0,1,0,0,0,1,0,0), ncol=10)
Y <- list(Y1, Y2)
Sa1 <- c(1,0,1,0,1,1,0,1,0,1)
```

```
Sa2 <- c(1,0,0,1,0,0,1,1,0,1)
Sa <- list(Sa1, Sa2)
Sat <- Rat <- do.call(plyr::rbind.fill.matrix, Sa)
Sb1 <- c(0,1,1,0,1,0,1,0,1,0)
Sb2 <- c(1,0,1,0,0,1,0,1,0,1)
Sb <- list(Sb1, Sb2)
Sbt <- do.call(plyr::rbind.fill.matrix, Sb)
Da1 <- abs(matrix(rep(Sa1,10), byrow = FALSE, ncol= 10) -
    matrix(rep(Sa1,10), byrow = TRUE, ncol= 10))
Da2 <- abs(matrix(rep(Sa2,10), byrow = FALSE, ncol= 10) -
    matrix(rep(Sa2,10), byrow = TRUE, ncol= 10))
Da <- list(Da1, Da2)
Dat <- do.call(plyr::rbind.fill.matrix, Da)
# estimate p2 model for two networks
M1 <- p2ML(Y, sender= ~ Sat + Sbt, receiver= ~ Rat, density = ~ Dat, adapt = 10, burnin = 100)
summary(M1)
# Notice: burn-in, and number of adaptive sequenses are
# much smaller than recommended to keep computation time low.
# recommended code:
## Not run:
M1 <- p2ML(Y,sender= ~ Sat + Sbt, receiver= ~ Rat, density = ~ Dat)
summary(M1)
## End(Not run)
# estimate p2 model for a single network
M2 <- p2ML(list(Y[[1]]),sender= ~ Sat[1:10,] + Sbt[1:10,], receiver= ~ Rat[1:10,],
density = ~ Dat[1:10,], adapt = 10, burnin = 100)
summary(M2)
# Notice: burn-in, and number of adaptive sequenses are
# much smaller than recommended to keep computation time low.
# recommended code:
## Not run:
M2 <- p2ML(list(Y[[1]]),sender= ~ Sat[1:10,] + Sbt[1:10,], receiver= ~ Rat[1:10,],
density = ~ Dat[1:10,])
summary(M2)
## End(Not run)
```


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