

This is one part of the simulation study to assess the performance of NCT: network structure invariance test, density=.1 and equally sized groups.

```
#!/usr/bin/env Rscript
args <- commandArgs(trailingOnly=TRUE)
if (length(args)==0){
  args <- 1
}

library(foreach)
library(parallel)
library(doParallel)
library(psych)
library("MASS")
library(GPARotation)
library("corpcor")
library("qgraph")
library("polycor")
library(pdist)
library(matrixcalc)
library(ggm)
library(sm)
library(lavaan)
library(Matrix)

###CLAUDIAS NCT code#####
NCT <- function(data1,
                 data2,
                 gamma,
                 it = 100,
                 binary.data=FALSE,
                 paired=FALSE,
                 weighted=TRUE,
                 AND=TRUE,
                 test.edges=FALSE,
                 edges,
                 progressBar=TRUE,
                 make.positive.definite=TRUE){

  if (missing(gamma)){
    if (binary.data){
      gamma <- 0.25
    } else {
      gamma <- 0.5
    }
  }
}

if (progressBar==TRUE) pb <- txtProgressBar(max=it, style = 3)
x1 <- data1
x2 <- data2
nobs1 <- nrow(x1)
nobs2 <- nrow(x2)
dataall <- rbind(x1,x2)
data.list <- list(x1,x2)
b <- 1:(nobs1+nobs2)
```

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nvars <- ncol(x1)
nedges <- nvars*(nvars-1)/2

glstrinv.perm <- glstrinv.real <- nwinv.real <- nwinv.perm <- c()
diffedges.perm <- matrix(0,it,nedges)
diffedges.permtemp <- matrix(0, nvars, nvars)
einv.perm.all <- array(NA,dim=c(nvars, nvars, it))
edges.pval.HBall <- matrix(NA,nvars,nvars)
edges.pvalmattemp <- matrix(0,nvars,nvars)

#####
### procedure for non-binary data ###
#####
## Real data
if(binary.data==FALSE)
{

cor_x1 <- cor(x1)
cor_x2 <- cor(x2)

if(make.positive.definite){
  # cor_x1 <- make.positive.definite(cor_x1)
  # cor_x2 <- make.positive.definite(cor_x2)
  cor_x1 <- matrix(nearPD(cor_x1, corr=TRUE)$mat, ncol = nvars)
  cor_x1 <- (cor_x1 + t(cor_x1)) / 2 # make symmetric
  cor_x2 <- matrix(nearPD(cor_x2, corr=TRUE)$mat, ncol = nvars)
  cor_x2 <- (cor_x2 + t(cor_x2)) / 2 # make symmetric
}

nw1 <- EBICglasso(cor_x1,nrow(x1),gamma=gamma)
nw2 <- EBICglasso(cor_x2,nrow(x2),gamma=gamma)
if(weighted==FALSE){
  nw1=(nw1!=0)*1
  nw2=(nw2!=0)*1
}

##### Invariance measures #####

## Global strength invariance
glstrinv.real <- abs(sum(abs(nw1[upper.tri(nw1)])) -
sum(abs(nw2[upper.tri(nw2)])))
# global strength of individual networks
glstrinv.sep <- c(sum(abs(nw1[upper.tri(nw1)])),
sum(abs(nw2[upper.tri(nw2)])))

## Individual edge invariance
diffedges.real <- abs(nw1-nw2)[upper.tri(abs(nw1-nw2))]
diffedges.realmat <- matrix(diffedges.real,it,nedges,byrow=TRUE)
diffedges.realoutput <- abs(nw1-nw2)

## Network structure invariance
nwinv.real <- max(diffedges.real)

## permuted data
for (i in 1:it)
{

```

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if(paired==FALSE)
{
  s <- sample(1:(nobs1+nobs2),nobs1,replace=FALSE)
  x1perm <- dataall[s,]
  x2perm <- dataall[b[-s],]

  cor_x1 <- cor(x1perm)
  cor_x2 <- cor(x2perm)

  if(make.positive.definite){
    # cor_x1 <- make.positive.definite(cor_x1)
    # cor_x2 <- make.positive.definite(cor_x2)
    cor_x1 <- matrix(nearPD(cor_x1, corr=TRUE)$mat, ncol = nvars)
    cor_x1 <- (cor_x1 + t(cor_x1)) / 2 # make symmetric
    cor_x2 <- matrix(nearPD(cor_x2, corr=TRUE)$mat, ncol = nvars)
    cor_x2 <- (cor_x2 + t(cor_x2)) / 2 # make symmetric
  }

  r1perm <- EBICglasso(cor_x1,nrow(x1perm), gamma=gamma)
  r2perm <- EBICglasso(cor_x2,nrow(x2perm), gamma=gamma)
  if(weighted==FALSE){
    r1perm=(r1perm!=0)*1
    r2perm=(r2perm!=0)*1
  }
}

if(paired==TRUE)
{
  s <- sample(c(1,2),nobs1,replace=TRUE)
  x1perm <- x1[s==1,]
  x1perm <- rbind(x1perm,x2[s==2,])
  x2perm <- x2[s==1,]
  x2perm <- rbind(x2perm,x1[s==2,])

  cor_x1 <- cor(x1perm)
  cor_x2 <- cor(x2perm)

  if(make.positive.definite){
    # cor_x1 <- make.positive.definite(cor_x1)
    # cor_x2 <- make.positive.definite(cor_x2)
    cor_x1 <- matrix(nearPD(cor_x1, corr=TRUE)$mat, ncol = nvars)
    cor_x1 <- (cor_x1 + t(cor_x1)) / 2 # make symmetric
    cor_x2 <- matrix(nearPD(cor_x2, corr=TRUE)$mat, ncol = nvars)
    cor_x2 <- (cor_x2 + t(cor_x2)) / 2 # make symmetric
  }

  r1perm <- EBICglasso(cor(x1perm),nrow(x1perm), gamma=gamma)
  r2perm <- EBICglasso(cor(x2perm),nrow(x2perm), gamma=gamma)
  if(weighted==FALSE){
    r1perm=(r1perm!=0)*1
    r2perm=(r2perm!=0)*1
  }
}

```

```

}

## Invariance measures for permuted data
glstrinv.perm[i] <- abs(sum(abs(r1perm[upper.tri(r1perm)])) -
sum(abs(r2perm[upper.tri(r2perm)])))
diffedges.perm[i,] <- abs(r1perm-r2perm)[upper.tri(abs(r1perm -
r2perm))]
diffedges.permtemp[upper.tri(diffedges.permtemp, diag=FALSE)] <-
diffedges.perm[i,]
diffedges.permtemp <- diffedges.permtemp + t(diffedges.permtemp)
einv.perm.all[, ,i] <- diffedges.permtemp
nwinv.perm[i] <- max(diffedges.perm[i,])

if (progressbar==TRUE) setTxtProgressBar(pb, i)
}

if(test.edges==TRUE)
{
# vector with uncorrected p values
edges.pvaltemp <- colSums(diffedges.perm >= diffedges.realmat)/it
# matrix with uncorrected p values
edges.pvalmattemp[upper.tri(edges.pvalmattemp, diag=FALSE)] <-
edges.pvaltemp
edges.pvalmattemp <- edges.pvalmattemp + t(edges.pvalmattemp)

if(is.character(edges))
{
ept.HBall <- p.adjust(edges.pvaltemp, method='holm')
# matrix with corrected p values
edges.pval.HBall[upper.tri(edges.pval.HBall, diag=FALSE)] <- ept.HBall
rownames(edges.pval.HBall) <- colnames(edges.pval.HBall) <-
colnames(data1)
einv.pvals <- melt(edges.pval.HBall, na.rm=TRUE, value.name = 'p-
value')
einv.perm <- einv.perm.all
einv.real <- diffedges.realoutput
}

if(is.list(edges))
{
einv.perm <- matrix(NA, it, length(edges))
colnames(einv.perm) <- edges
uncorrvpvals <- einv.real <- c()
for(j in 1:length(edges))
{
uncorrvpvals[j] <- edges.pvalmattemp[edges[[j]][1], edges[[j]][2]]
einv.real[j] <- diffedges.realoutput[edges[[j]][1], edges[[j]][2]]
for(l in 1:it){
einv.perm[l,j] <- einv.perm.all[, ,l][edges[[j]][1],
edges[[j]][2]]
}
}
HBcorrvpvals <- p.adjust(uncorrvpvals, method='holm')
einv.pvals <- HBcorrvpvals
}

edges.tested <- colnames(einv.perm)

```

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res <- list(glstrinv.real = glstrinv.real,
           glstrinv.sep = glstrinv.sep,
           glstrinv.pval = sum(glstrinv.perm >= glstrinv.real)/it,
           glstrinv.perm = glstrinv.perm,
           nwinv.real = nwinv.real,
           nwinv.pval = sum(nwinv.perm >= nwinv.real)/it,
           nwinv.perm = nwinv.perm,
           edges.tested = edges.tested,
           einv.real = einv.real,
           einv.pvals = einv.pvals,
           einv.perm = einv.perm,
           nw1 = nw1,
           nw2 = nw2)
}

if (progressbar==TRUE) close(pb)

if(test.edges==FALSE)
{
  res <- list(
    glstrinv.real = glstrinv.real,
    glstrinv.sep = glstrinv.sep,
    glstrinv.pval = sum(glstrinv.perm >= glstrinv.real)/it,
    glstrinv.perm = glstrinv.perm,
    nwinv.real = nwinv.real,
    nwinv.pval = sum(nwinv.perm >= nwinv.real)/it,
    nwinv.perm = nwinv.perm,
    nw1 = nw1,
    nw2 = nw2
  )
}

}

#####
### procedure for binary data ###
#####
## Real data
if(binary.data==TRUE)
{
  IF1 <- IsingFit(x1, AND = AND, gamma=gamma, plot=FALSE,
progressbar=FALSE)
  IF2 <- IsingFit(x2, AND = AND, gamma=gamma, plot=FALSE,
progressbar=FALSE)
  nw1 <- IF1$weiadj
  nw2 <- IF2$weiadj
  if(weighted==FALSE){
    nw1=(nw1!=0)*1
    nw2=(nw2!=0)*1
  }

##### Invariance measures #####

## Global strength invariance
glstrinv.real <- abs(sum(abs(nw1[upper.tri(nw1)])) -
sum(abs(nw2[upper.tri(nw2)])))

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```

# global strength of individual networks
glstrinv.sep <- c(sum(abs(nw1[upper.tri(nw1)])),
sum(abs(nw2[upper.tri(nw2)])))

## Individual edge invariance
diffedges.real <- abs(nw1-nw2)[upper.tri(abs(nw1-nw2))]
diffedges.realmat <- matrix(diffedges.real,it,nedges,byrow=TRUE)
diffedges.realoutput <- abs(nw1-nw2)

## Network structure invariance
nwinv.real <- max(diffedges.real)

## permuted data
for (i in 1:it)
{
  if(paired==FALSE)
  {
    # a check to prevent an error of lognet(): a variable with only one 0
or 1 is not allowed
    checkN=0
    while(checkN==0){
      s <- sample(1:(nobs1+nobs2),nobs1,replace=FALSE)
      x1perm <- dataall[s,]
      x2perm <- dataall[b[-s],]

      cm1 <- colMeans(x1perm)
      cm2 <- colMeans(x2perm)
      checkN=ifelse(any(cm1<(1/nobs1)) | any(cm1>(nobs1-1)/nobs1) |
any(cm2<(1/nobs2)) | any(cm2>(nobs2-1)/nobs2),0,1)
    }
    IF1perm <- IsingFit(x1perm, AND = AND, gamma=gamma, plot=FALSE,
progressbar=FALSE)
    IF2perm <- IsingFit(x2perm, AND = AND, gamma=gamma, plot=FALSE,
progressbar=FALSE)
    r1perm <- IF1perm$weiadj
    r2perm <- IF2perm$weiadj
    if(weighted==FALSE){
      r1perm=(r1perm!=0)*1
      r2perm=(r2perm!=0)*1
    }
  }

  if(paired==TRUE)
  {
    checkN=0
    while(checkN==0)
    {
      s <- sample(c(1,2),nobs1,replace=TRUE)
      x1perm <- x1[s==1,]
      x1perm <- rbind(x1perm,x2[s==2,])
      x2perm <- x2[s==1,]
      x2perm <- rbind(x2perm,x1[s==2,])

      cm1 <- colMeans(x1perm)
      cm2 <- colMeans(x2perm)
      checkN=ifelse(any(cm1<(1/nobs1)) | any(cm1>(nobs1-1)/nobs1) |
any(cm2<(1/nobs2)) | any(cm2>(nobs2-1)/nobs2),0,1)
    }
  }
}

```

```

    }

    IF1perm <- IsingFit(x1perm, AND = AND, gamma=gamma, plot=FALSE,
progressbar=FALSE)
    IF2perm <- IsingFit(x2perm, AND = AND, gamma=gamma, plot=FALSE,
progressbar=FALSE)
    r1perm <- IF1perm$weiadj
    r2perm <- IF2perm$weiadj
    if(weighted==FALSE)
    {
        r1perm=(r1perm!=0)*1
        r2perm=(r2perm!=0)*1
    }
}

## Invariance measures for permuted data
glstrinv.perm[i] <- abs(sum(abs(r1perm[upper.tri(r1perm)])) -
sum(abs(r2perm[upper.tri(r2perm)])))
diffeedges.perm[i,] <- abs(r1perm - r2perm)[upper.tri(abs(r1perm -
r2perm))]
diffeedges.permtemp[upper.tri(diffeedges.permtemp, diag=FALSE)] <-
diffeedges.perm[i,]
diffeedges.permtemp <- diffeedges.permtemp + t(diffeedges.permtemp)
einv.perm.all[, ,i] <- diffeedges.permtemp
nwinv.perm[i] <- max(diffeedges.perm[i,])

if (progressbar==TRUE) setTxtProgressBar(pb, i)
}

if(test.edges==TRUE)
{
    # vector with uncorrected p values
    edges.pvaltemp <- colSums(diffeedges.perm >= diffeedges.realmat)/it
    # matrix with uncorrected p values
    edges.pvalmattemp[upper.tri(edges.pvalmattemp,diag=FALSE)] <-
edges.pvaltemp
    edges.pvalmattemp <- edges.pvalmattemp + t(edges.pvalmattemp)

    if(is.character(edges))
    {
        ept.HBall <- p.adjust(edges.pvaltemp, method='holm')
        # matrix with corrected p values
        edges.pval.HBall[upper.tri(edges.pval.HBall,diag=FALSE)] <- ept.HBall
        rownames(edges.pval.HBall) <- colnames(edges.pval.HBall) <-
colnames(data1)
        einv.pvals <- melt(edges.pval.HBall, na.rm=TRUE, value.name = 'p-
value')
        einv.perm <- einv.perm.all
        einv.real <- diffeedges.realoutput
    }

    if(is.list(edges))
    {
        einv.perm <- matrix(NA,it,length(edges))
        colnames(einv.perm) <- edges
        uncorrvals <- einv.real <- c()
    }
}

```

```

    for(j in 1:length(edges))
    {
      uncorrpvls[j] <- edges.pvalmattemp[edges[[j]][1], edges[[j]][2]]
      einv.real[j] <- diffedges.realoutput[edges[[j]][1], edges[[j]][2]]
      for(l in 1:it){
        einv.perm[l,j] <- einv.perm.all[,l][edges[[j]][1],
edges[[j]][2]]
      }
    }
    HBcorrpvls <- p.adjust(uncorrpvls, method='holm')
    einv.pvals <- HBcorrpvls
  }

edges.tested <- colnames(einv.perm)

res <- list(glstrinv.real = glstrinv.real,
           glstrinv.sep = glstrinv.sep,
           glstrinv.pval = sum(glstrinv.perm >= glstrinv.real)/it,
           glstrinv.perm = glstrinv.perm,
           nwinv.real = nwinv.real,
           nwinv.pval = sum(nwinv.perm >= nwinv.real)/it,
           nwinv.perm = nwinv.perm,
           edges.tested = edges.tested,
           einv.real = einv.real,
           einv.pvals = einv.pvals,
           einv.perm = einv.perm)
}

if (progressbar==TRUE) close(pb)

if(test.edges==FALSE)
{
  res <- list(
    glstrinv.real = glstrinv.real,
    glstrinv.sep = glstrinv.sep,
    glstrinv.pval = sum(glstrinv.perm >= glstrinv.real)/it,
    glstrinv.perm = glstrinv.perm,
    nwinv.real = nwinv.real,
    nwinv.pval = sum(nwinv.perm >= nwinv.real)/it,
    nwinv.perm = nwinv.perm
  )
}
}

class(res) <- "NCT"
return(res)
}

## Methods:

summary.NCT <- function(x,...){

  cat("\n NETWORK INVARIANCE TEST
      Test statistic M: ", x$nwinv.real,
      "\n p-value", x$nwinv.pval,
      "\n\n GLOBAL STRENGTH INVARIANCE TEST

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Global strength per group: ", x$glstrinv.sep,
"\n Test statistic S: ", x$glstrinv.real,
"\n p-value", x$glstrinv.pval,
"\n\n EDGE INVARIANCE TEST
Edges tested: ", x$edges.tested,
"\n Test statistic E: ", x$einv.real,
"\n p-value", x$einv.pvals
)
}

plot.NCT <- function(x,what = c("strength","network","edge"),...){

  what <- match.arg(what)

  ## Plot results of global strength invariance test (not reliable with only
  10 permutations!):
  if (what == "strength"){
    hist(x$glstrinv.perm, main=paste('p =', x$glstrinv.pval), xlab =
'Difference in global strength', xlim = c(0, max(x$glstrinv.real,
x$glstrinv.perm)))
    points(x$glstrinv.real, 0, col='red', pch=17)
  }

  if (what == "network"){

    ## Plot results of the network invariance test (not reliable with only 10
    permutations!):
    hist(x$nwinv.perm, main=paste('p =', x$nwinv.pval), xlab='Maximum of
    difference', xlim = c(0, max(x$nwinv.real, x$nwinv.perm)))
    points(x$nwinv.real, 0, col='red', pch=17)
  }

  if (what == "edge"){

    ## Plot results of the maximum difference in edge weights (not reliable
    with only 10 permutations)
    nedgetests <- ncol(x$einv.perm)
    for(i in 1:nedgetests){
      hist(x$einv.perm[,i], main=paste('p =', x$einv.pval[i]),
      xlab=paste('Difference in edge strength ', colnames(x$einv.perm)[i]),
      xlim=c(0, max(x$einv.real, x$einv.perm)))
      points(x$einv.real[i], 0, col='red', pch=17)
    }

  } #else stop("Method not implemented yet.")
}

##### END OF CLAUDIAS NCT CODE
#####

graph.data <- function(d, n, gm=NA, theta=NA, prob, v=0.1, u=0.1,
upper.bound=.9, lower.bound=.3){
  # simulates graph
  count=0
  repeat{

```

```

if(any(is.na(gm)) & any(is.na(theta))){
  gm.ig <- erdos.renyi.game(d,prob)
  gm <- as.matrix(get.adjacency(gm.ig))
  theta = matrix(runif(d^2, lower.bound, upper.bound), d, d) * gm
  diag(theta) = 0
  omega = theta * v
  diag(omega) = abs(min(Re(eigen(omega)$values))) + 0.1 + u
  omega <- as.matrix(forceSymmetric(omega))
  if(!is.positive.definite(omega)) gm=theta=NA else break
}
if(!any(is.na(gm)) & !any(is.na(theta))){
  omega = theta * v
  diag(omega) = abs(min(Re(eigen(omega)$values))) + 0.1 + u
  omega <- as.matrix(forceSymmetric(omega))
  if(is.positive.definite(omega)) break
}
if(!any(is.na(gm)) & any(is.na(theta))){
  theta = matrix(runif(d^2, lower.bound, upper.bound), d, d) * gm
  omega = theta * v
  diag(omega) = abs(min(Re(eigen(omega)$values))) + 0.1 + u
  omega <- as.matrix(forceSymmetric(omega))
  if(!is.positive.definite(omega)) theta=NA else break
}
count=count+1
print(count)
}
sigma = cov2cor(solve(omega))
omega = solve(sigma)
x = mvrnorm(n, rep(0, d), sigma)
sigmahat = cor(x)
results <- list(data=x, sigma=sigma, theta=theta, gm=gm)
return(results)
}

##### programming the permutation test in parallel test
#####

nCores <- 16
loops<-1000

#conditions
#hypotheses: H0 =H0 H1 =maximum edge split halves, H2=maximum edge is set to
zero
eq<-"equal" #group1 is denser than group2, equal= equal groupsizes, unequal1
= group1 (the denser group) is larger, unequal2= group2 the less dense group
is larger
dens<-0.1
l<-4#samplesizes
threeGammas <- list(gamma0=list(), gamma25=list(), gamma50=list())
for(gam in 1:3){
  if(gam==1){gamma<-0}else if(gam==2) {gamma<-0.25} else {gamma<-0.5}
threeVariableNumbers <- list(NV10=list(), NV20=list(), NV30=list())
for(nv in 1:3){
  nV<-nv*10

```

```

threehypotheses <- list(H0=list(), H1=list(), H2=list()) #H0 is equal, H1
is edge split half H2 is edge zero
for(h in 0:2){
  hypothesis <- h
  allsamplesizes <- list(nobs250=list(), nobs500=list(), nobs750=list(),
nobs1000=list())
  for(n in 1:1){
    if(eq=="equal"){nobs <- n*250; nobs2<-n*250} else if(eq=="unequal1")
{nobs<-n*250; nobs2<-1.5*nobs} else {nobs2<-n*250; nobs<-1.5*nobs2}
    minnobs <- n*250
    cl <- nCores-1 # no of cores
    cl <- makeCluster(cl, outfile="") #registering
    registerDoParallel(cl)
    #saveoutput
    corgr1<-list(I(replicate(loops,matrix(rep(NA, nV*nV), nV))))
    corgr2<-list(I(replicate(loops,matrix(rep(NA, nV*nV), nV))))
    NW1<-list(I(replicate(loops,matrix(rep(NA, nV*nV), nV))))
    NW2<-list(I(replicate(loops,matrix(rep(NA, nV*nV), nV))))
    pvalues<-rep(NA,loops)
    #loop
    output<-foreach(gr=1:loops, .combine='rbind', .multicombine=TRUE,
.init=list(list(), list()), .packages=c("psych", "MASS", "GPARotation",
"corpcor", "qgraph", "polycor", "pdist", "matrixcalc", "ggm", "sm", "lavaan",
"igraph", "Matrix", "matrixcalc", "MASS")) %dopar% {
      graph<-graph.data(nV, nobs, prob=dens, upper.bound=-1,
lower.bound=-5)
      cor1<-graph$sigma
      pcor1<-round(cor2pcor(cor1),4)
      data1<-graph$data #mvrnorm(nobs,mu=rep(0,nV), Sigma=cor1)
      lowerpcor<-pcor1[lower.tri(pcor1)]
      edges<-which(lowerpcor!=0)
      nedges<-length(edges)
      if(hypothesis==0){
        pcor2<-pcor1
        data2<-mvrnorm(nobs2,mu=rep(0,nV), Sigma=cor1)
      }
      if(hypothesis==1){
        row<-as.numeric(which(pcor1 == max(lowerpcor), arr.ind = T)[1,1])
        col<-as.numeric(which(pcor1 == max(lowerpcor), arr.ind = T)[1,2])
        newvalue<-max(lowerpcor)/2
        pcor2<-pcor1
        pcor2[row,col]<-newvalue
        pcor2[col,row]<-newvalue
        cor2<-pcor2cor(pcor2)
        data2<-mvrnorm(nobs2, mu=rep(0,nV), Sigma=cor2)
      }
      if(hypothesis==2){
        row<-as.numeric(which(pcor1 == max(lowerpcor), arr.ind = T)[1,1])
        col<-as.numeric(which(pcor1 == max(lowerpcor), arr.ind = T)[1,2])
        newvalue<-0
        pcor2<-pcor1
        pcor2[row,col]<-newvalue
        pcor2[col,row]<-newvalue
        cor2<-pcor2cor(pcor2)
        data2<-mvrnorm(nobs2, mu=rep(0, nV), Sigma=cor2)
      }
    }
  }
}

```

```

    pvalues[gr]<-NCT(data1, data2, gamma=gamma,
progressbar=F)$nwinv.pval
    corgr1[[gr]]<-cor(data1)
    corgr2[[gr]]<-cor(data2)
    NW1[[gr]]<-pcor1
    NW2[[gr]]<-pcor2
    rejections<-list("pvalues"=pvalues[gr], "corgr1"=I(corgr1[[gr]]),
"corgr2"=I(corgr2[[gr]]), "NW1"=I(NW1[[gr]]), "NW2"=I(NW2[[gr]]))
    return(rejections)
  }
  stopCluster(cl)
  #str(output)
  output<-output[-1,]
  rownames(output)<-NULL

  #separate vectors from matrices (output1, elements are values,
output2 elements are matrices)
  output1<-output[,1]
  output2<-output[,2:5]

  #when one column in output1:
  dataA<-unlist(output1)
  #when multiple columns in output1:
  #dataA<-unlist(output1[,1])
  #for(i in 2:ncol(output1)){
  # dataA<-cbind(dataA,unlist(output1[,i]))
  #}

  dataB<-I(output2[,1])
  for(i in 2:ncol(output2)){
    dataB<-data.frame(dataB,I(output2[,i]))
  }

  combinedoutput<-data.frame(dataA,dataB)
  colnames(combinedoutput)<-colnames(output)

  allsamplesizes[[n]]<-combinedoutput

  #sum(pvalues<0.05)/loops
  }
  threehypotheses[[h+1]]<-allsamplesizes
  }
  threeVariableNumbers[[nv]]<-threehypotheses
  }
threeGammas[[gam]]<-threeVariableNumbers
}
saveRDS(threeGammas, file=paste0("output_invariance_dens1_equal.rds"))

#saveRDS(completeoutput, file="bootstrap_5var_positive_2500nobs.rds")
#saveRDS(output_bootstrap, file=paste0("bootstrap_", args, ".rds"))

```