Chapter 3

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13 February 2020

Contents

Libraries and data used	ed	1
Libraries		. 1
Data		. 4
Creating and managing	g networks	4
creating net in netstat	;	4
Managing Node and T	Γie Attribures	. 7
Node attrib		. 7
Tie Attrib		. 8
e e	ect in igraph	
Going back and forth b	between statman and igraph	. 10
importing network dat	ta	10
Common network data	a tasks	13
Filtering networks daved on vertex or edge attribute values		. 13
_	n Node Values	
remove isolates .		. 15
filtering based on	n edge values	. 16
transformining directed	ed to non-directed network	. 21
Libraries and da	ata used	
Libraries		
library(UserNetR) library(statnet)		
## Loading required pa	ackage: tergm	
## Loading required pa	ackage: ergm	
## Loading required pa	ackage: network	
## network: Classes fo		
## Version 1.16.0 crea		
	, Carter T. Butts, University of California-Irvine	
##	Mark S. Handcock, University of California Los Angeles	
##	David R. Hunter, Penn State University	
## ##	Martina Morris, University of Washington Skye Bender-deMoll, University of Washington	
##	akve bender-demott. University of Washington	

```
## For citation information, type citation("network").
## Type help("network-package") to get started.
## ergm: version 3.10.4, created on 2019-06-10
## Copyright (c) 2019, Mark S. Handcock, University of California -- Los Angeles
                       David R. Hunter, Penn State University
##
##
                       Carter T. Butts, University of California -- Irvine
##
                       Steven M. Goodreau, University of Washington
                       Pavel N. Krivitsky, University of Wollongong
##
##
                       Martina Morris, University of Washington
                       with contributions from
##
##
                       Li Wang
##
                       Kirk Li, University of Washington
##
                       Skye Bender-deMoll, University of Washington
##
                       Chad Klumb
## Based on "statnet" project software (statnet.org).
## For license and citation information see statnet.org/attribution
## or type citation("ergm").
## NOTE: Versions before 3.6.1 had a bug in the implementation of the bd()
## constriant which distorted the sampled distribution somewhat. In
## addition, Sampson's Monks datasets had mislabeled vertices. See the
## NEWS and the documentation for more details.
## NOTE: Some common term arguments pertaining to vertex attribute and
## level selection have changed in 3.10.0. See terms help for more
## details. Use 'options(ergm.term=list(version="3.9.4"))' to use old
## behavior.
## Loading required package: networkDynamic
##
## networkDynamic: version 0.10.1, created on 2020-01-16
## Copyright (c) 2020, Carter T. Butts, University of California -- Irvine
                       Ayn Leslie-Cook, University of Washington
##
##
                       Pavel N. Krivitsky, University of Wollongong
                       Skye Bender-deMoll, University of Washington
##
##
                       with contributions from
                       Zack Almquist, University of California -- Irvine
##
                       David R. Hunter, Penn State University
##
##
                       Li Wang
##
                       Kirk Li, University of Washington
##
                       Steven M. Goodreau, University of Washington
##
                       Jeffrey Horner
                       Martina Morris, University of Washington
## Based on "statnet" project software (statnet.org).
## For license and citation information see statnet.org/attribution
## or type citation("networkDynamic").
##
## tergm: version 3.6.1, created on 2019-06-12
## Copyright (c) 2019, Pavel N. Krivitsky, University of Wollongong
##
                       Mark S. Handcock, University of California -- Los Angeles
##
                       with contributions from
##
                       David R. Hunter, Penn State University
##
                       Steven M. Goodreau, University of Washington
```

```
##
                       Martina Morris, University of Washington
##
                       Nicole Bohme Carnegie, New York University
##
                       Carter T. Butts, University of California -- Irvine
                       Ayn Leslie-Cook, University of Washington
##
##
                       Skye Bender-deMoll
                       Li Wang
##
                       Kirk Li, University of Washington
## Based on "statnet" project software (statnet.org).
## For license and citation information see statnet.org/attribution
## or type citation("tergm").
## Loading required package: ergm.count
##
## ergm.count: version 3.4.0, created on 2019-05-15
## Copyright (c) 2019, Pavel N. Krivitsky, University of Wollongong
##
                       with contributions from
##
                       Mark S. Handcock, University of California -- Los Angeles
                       David R. Hunter, Penn State University
##
## Based on "statnet" project software (statnet.org).
## For license and citation information see statnet.org/attribution
## or type citation("ergm.count").
## NOTE: The form of the term 'CMP' has been changed in version 3.2 of
## 'ergm.count'. See the news or help('CMP') for more information.
## Loading required package: sna
## Loading required package: statnet.common
## Attaching package: 'statnet.common'
## The following object is masked from 'package:base':
##
##
       order
## sna: Tools for Social Network Analysis
## Version 2.5 created on 2019-12-09.
## copyright (c) 2005, Carter T. Butts, University of California-Irvine
## For citation information, type citation("sna").
## Type help(package="sna") to get started.
## Loading required package: tsna
##
## statnet: version 2019.6, created on 2019-06-13
## Copyright (c) 2019, Mark S. Handcock, University of California -- Los Angeles
                       David R. Hunter, Penn State University
##
                       Carter T. Butts, University of California -- Irvine
##
##
                       Steven M. Goodreau, University of Washington
##
                       Pavel N. Krivitsky, University of Wollongong
##
                       Skye Bender-deMoll
                       Martina Morris, University of Washington
## Based on "statnet" project software (statnet.org).
## For license and citation information see statnet.org/attribution
## or type citation("statnet").
## unable to reach CRAN
```

```
#library(igraph) will be loaded in flow to prevent interferance with statnet library(intergraph)
```

Data

```
data("ICTS_G10")
data("DHHS")
```

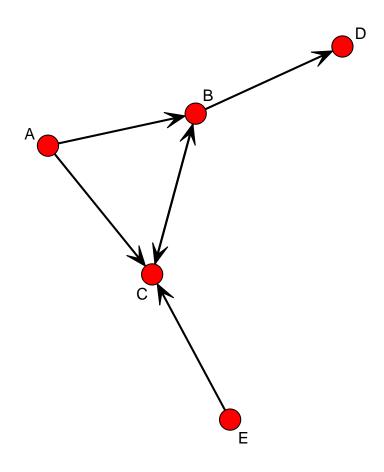
Creating and managing networks

creating net in netstat

```
## [1] "network"
summary(net1)
```

```
## Network attributes:
##
   vertices = 5
    directed = TRUE
##
##
   hyper = FALSE
## loops = FALSE
##
    multiple = FALSE
##
   bipartite = FALSE
## total edges = 6
     missing edges = 0
##
     non-missing edges = 6
## density = 0.3
##
## Vertex attributes:
##
    vertex.names:
##
     character valued attribute
##
     5 valid vertex names
##
## No edge attributes
##
## Network adjacency matrix:
   ABCDE
## A O 1 1 O O
## B O O 1 1 O
## C O 1 O O O
## D O O O O
## E O O 1 O O
```

```
gplot(net1,
    vertex.col = 2,
    displaylabels = TRUE)
```



```
## Network attributes:
##
    vertices = 5
     directed = TRUE
##
##
    hyper = FALSE
##
    loops = FALSE
##
    multiple = FALSE
   bipartite = FALSE
## total edges = 6
##
     missing edges = 0
##
     non-missing edges = 6
## density = 0.3
##
## Vertex attributes:
##
   vertex.names:
##
      character valued attribute
##
      5 valid vertex names
##
## No edge attributes
## Network adjacency matrix:
## A B C D E
## A O 1 1 O O
## B O O 1 1 O
## C O 1 O O O
## D O O O O
## E O O 1 O O
as.sociomatrix(net1)
   ABCDE
## A O 1 1 O O
## B O O 1 1 O
## C O 1 O O O
## D O O O O
## E 0 0 1 0 0
class(as.sociomatrix(net1))
## [1] "matrix"
all(as.matrix(net1) == as.sociomatrix(net1))
## [1] TRUE
as.matrix(net1, matrix.type = "edgelist")
        [,1] [,2]
##
## [1,]
          1
## [2,]
           3
               2
## [3,]
## [4,]
        2
              3
## [5,]
          5
## [6,]
           2
## attr(,"n")
## [1] 5
## attr(,"vnames")
## [1] "A" "B" "C" "D" "E"
```

Managing Node and Tie Attribures

Node attrib

```
set.vertex.attribute(net1,
                     "gender",
                     c("F", "F", "M", "F", "M"))
net1 %v% "alldeg" <- degree(net1)</pre>
list.vertex.attributes(net1)
## [1] "alldeg"
                      "gender"
                                      "na"
                                                     "vertex.names"
summary(net1)
## Network attributes:
##
    vertices = 5
##
     directed = TRUE
##
    hyper = FALSE
##
    loops = FALSE
##
    multiple = FALSE
    bipartite = FALSE
##
## total edges = 6
##
     missing edges = 0
     non-missing edges = 6
  density = 0.3
##
##
## Vertex attributes:
##
##
  alldeg:
##
     numeric valued attribute
##
      attribute summary:
##
     Min. 1st Qu. Median
                              Mean 3rd Qu.
                                               Max.
      1.0
                      2.0
                               2.4
##
              1.0
                                       4.0
                                                4.0
##
##
  gender:
##
      character valued attribute
##
      attribute summary:
## F M
## 3 2
##
    vertex.names:
##
      character valued attribute
##
      5 valid vertex names
##
## No edge attributes
##
## Network adjacency matrix:
   ABCDE
## A O 1 1 O O
## B 0 0 1 1 0
## C O 1 O O O
## D O O O O
## E O O 1 O O
get.vertex.attribute(net1, "gender")
## [1] "F" "F" "M" "F" "M"
```

```
net1 %v% "alldeg"
## [1] 2 4 4 1 1
Tie Attrib
list.edge.attributes(net1)
## [1] "na"
set.edge.attribute(net1,
                   runif(network.size(net1),0,1))
list.edge.attributes(net1)
## [1] "na"
                "rndval"
summary(net1 %e% "rndval")
      Min. 1st Qu. Median
                              Mean 3rd Qu.
                                              Max.
## 0.3258 0.4438 0.4763 0.5315 0.6020 0.8337
summary(get.edge.attribute(net1, "rndval"))
      Min. 1st Qu. Median
##
                             Mean 3rd Qu.
                                              Max.
## 0.3258 0.4438 0.4763 0.5315 0.6020 0.8337
netval1 <- rbind(c(0,2,3,0,0),
                 c(0,0,3,1,0),
                 c(0,1,0,0,0),
                 c(0,0,0,0,0),
                 c(0,0,2,0,0))
netval1 <- network(netval1,</pre>
                   matrix.type = "adjacency",
                   ignore.eval = FALSE,
                   names.eval = "like")
network.vertex.names(netval1) <- c("A", "B", "C", "D", "E")</pre>
list.edge.attributes(netval1)
## [1] "like" "na"
get.edge.attribute(netval1, "like")
## [1] 2 1 3 3 2 1
as.sociomatrix(netval1)
## ABCDE
## A O 1 1 O O
## B O O 1 1 O
## C O 1 O O O
## D O O O O
## E O O 1 O O
as.sociomatrix(netval1)
   ABCDE
## A O 1 1 O O
## B O O 1 1 O
```

```
## C O 1 O O O ## D O O O O O O O O O O
```

Creating network object in igraph

```
detach(package:statnet, unload = TRUE)
detach(package:sna, unload = TRUE)
detach(package:tsna, unload = TRUE)
detach(package:ergm.count, unload = TRUE)
detach(package:tergm, unload = TRUE)
detach(package:networkDynamic, unload = TRUE)
detach(package:ergm, unload = TRUE)
detach(package:network, unload = TRUE)
## Warning: 'network' namespace cannot be unloaded:
     namespace 'network' is imported by 'intergraph' so cannot be unloaded
detach(package:statnet.common, unload = TRUE)
library(igraph)
##
## Attaching package: 'igraph'
## The following objects are masked from 'package:stats':
##
##
       decompose, spectrum
## The following object is masked from 'package:base':
##
##
       union
inet1 <- graph.adjacency(netmat1)</pre>
class(inet1)
## [1] "igraph"
summary(inet1)
## IGRAPH 84868b6 DN-- 5 6 --
## + attr: name (v/c)
#str(inet1)
inet2 <- graph.edgelist(netmat2)</pre>
summary(inet2)
## IGRAPH 8488120 D--- 5 6 --
V(inet2)$name <- c("A", "B", "C", "D", "E")
E(inet2)$val <- c(1:6)
summary(inet2)
## IGRAPH 8488120 DN-- 5 6 --
## + attr: name (v/c), val (e/n)
#str(inet2)
```

Going back and forth between statman and igraph

```
library(intergraph)

class(net1)

## [1] "network"

net1igraph <- asIgraph(net1)
class(net1igraph)

## [1] "igraph"

#str(net1igraph)</pre>
```

importing network data

```
detach(package:igraph, unload = TRUE)
library(statnet)
## Loading required package: tergm
## Loading required package: ergm
## Loading required package: network
## network: Classes for Relational Data
## Version 1.16.0 created on 2019-11-30.
## copyright (c) 2005, Carter T. Butts, University of California-Irvine
                       Mark S. Handcock, University of California -- Los Angeles
##
##
                       David R. Hunter, Penn State University
##
                       Martina Morris, University of Washington
                       Skye Bender-deMoll, University of Washington
##
   For citation information, type citation("network").
##
   Type help("network-package") to get started.
##
##
## ergm: version 3.10.4, created on 2019-06-10
  Copyright (c) 2019, Mark S. Handcock, University of California -- Los Angeles
##
                       David R. Hunter, Penn State University
##
                       Carter T. Butts, University of California -- Irvine
##
                       Steven M. Goodreau, University of Washington
                       Pavel N. Krivitsky, University of Wollongong
##
                       Martina Morris, University of Washington
##
##
                       with contributions from
##
                       Li Wang
##
                       Kirk Li, University of Washington
##
                       Skye Bender-deMoll, University of Washington
##
                       Chad Klumb
## Based on "statnet" project software (statnet.org).
## For license and citation information see statnet.org/attribution
## or type citation("ergm").
## NOTE: Versions before 3.6.1 had a bug in the implementation of the bd()
## constriant which distorted the sampled distribution somewhat. In
## addition, Sampson's Monks datasets had mislabeled vertices. See the
## NEWS and the documentation for more details.
```

```
## NOTE: Some common term arguments pertaining to vertex attribute and
## level selection have changed in 3.10.0. See terms help for more
## details. Use 'options(ergm.term=list(version="3.9.4"))' to use old
## behavior.
## Loading required package: networkDynamic
## networkDynamic: version 0.10.1, created on 2020-01-16
## Copyright (c) 2020, Carter T. Butts, University of California -- Irvine
##
                       Ayn Leslie-Cook, University of Washington
##
                       Pavel N. Krivitsky, University of Wollongong
                       Skye Bender-deMoll, University of Washington
##
##
                       with contributions from
                       Zack Almquist, University of California -- Irvine
##
##
                       David R. Hunter, Penn State University
##
                       Li Wang
##
                       Kirk Li, University of Washington
##
                       Steven M. Goodreau, University of Washington
##
                       Jeffrey Horner
##
                       Martina Morris, University of Washington
## Based on "statnet" project software (statnet.org).
## For license and citation information see statnet.org/attribution
## or type citation("networkDynamic").
##
## tergm: version 3.6.1, created on 2019-06-12
## Copyright (c) 2019, Pavel N. Krivitsky, University of Wollongong
                       Mark S. Handcock, University of California -- Los Angeles
##
##
                       with contributions from
##
                       David R. Hunter, Penn State University
##
                       Steven M. Goodreau, University of Washington
##
                       Martina Morris, University of Washington
                       Nicole Bohme Carnegie, New York University
##
                       Carter T. Butts, University of California -- Irvine
##
##
                       Ayn Leslie-Cook, University of Washington
                       Skye Bender-deMoll
##
##
                       Li Wang
                       Kirk Li, University of Washington
## Based on "statnet" project software (statnet.org).
## For license and citation information see statnet.org/attribution
## or type citation("tergm").
## Loading required package: ergm.count
## ergm.count: version 3.4.0, created on 2019-05-15
## Copyright (c) 2019, Pavel N. Krivitsky, University of Wollongong
                       with contributions from
                       Mark S. Handcock, University of California -- Los Angeles
##
                       David R. Hunter, Penn State University
##
## Based on "statnet" project software (statnet.org).
## For license and citation information see statnet.org/attribution
## or type citation("ergm.count").
## NOTE: The form of the term 'CMP' has been changed in version 3.2 of
## 'ergm.count'. See the news or help('CMP') for more information.
```

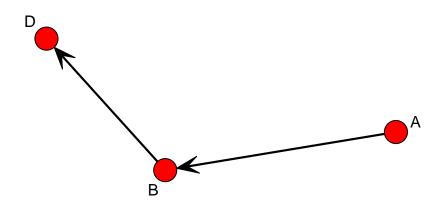
```
## Loading required package: sna
## Loading required package: statnet.common
##
## Attaching package: 'statnet.common'
## The following object is masked from 'package:base':
##
##
       order
## sna: Tools for Social Network Analysis
## Version 2.5 created on 2019-12-09.
## copyright (c) 2005, Carter T. Butts, University of California-Irvine
## For citation information, type citation("sna").
## Type help(package="sna") to get started.
## Loading required package: tsna
##
## statnet: version 2019.6, created on 2019-06-13
## Copyright (c) 2019, Mark S. Handcock, University of California -- Los Angeles
                       David R. Hunter, Penn State University
##
                       Carter T. Butts, University of California -- Irvine
##
                       Steven M. Goodreau, University of Washington
                       Pavel N. Krivitsky, University of Wollongong
##
##
                       Skye Bender-deMoll
##
                       Martina Morris, University of Washington
## Based on "statnet" project software (statnet.org).
## For license and citation information see statnet.org/attribution
## or type citation("statnet").
## unable to reach CRAN
netmat3 <- rbind(c("A","B"),
                 c("A","C"),
                 c("B","C"),
                 c("B", "D"),
                 c("C", "B"),
                 c("E","C"))
net.df <- data.frame(netmat3)</pre>
net.df
##
   X1 X2
## 1 A B
## 2 A C
## 3 B C
## 4 B D
## 5 C B
## 6 E C
write.csv(net.df,
          file = "MyData.csv",
         row.names = FALSE)
net.edge <- read.csv(file = "MyData.csv")</pre>
net_import <- network(net.edge,</pre>
                      matrix.type = "edgelist")
summary(net_import)
```

```
## Network attributes:
##
    vertices = 5
##
     directed = TRUE
##
    hyper = FALSE
##
    loops = FALSE
##
    multiple = FALSE
##
    bipartite = FALSE
## total edges = 6
##
     missing edges = 0
##
     non-missing edges = 6
##
   density = 0.3
##
## Vertex attributes:
##
   vertex.names:
##
      character valued attribute
##
      5 valid vertex names
##
## No edge attributes
##
## Network adjacency matrix:
##
    ABCDE
## A O 1 1 O O
## B O O 1 1 O
## C O 1 O O O
## D O O O O
## E O O 1 O O
gden(net_import)
## [1] 0.3
```

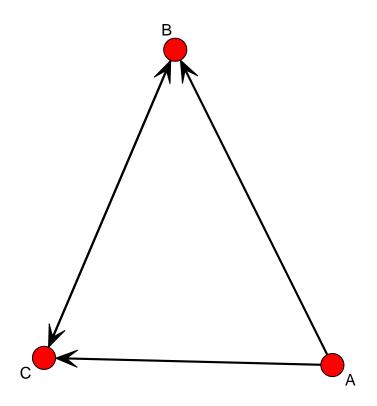
Common network data tasks

Filtering networks daved on vertex or edge attribute values

Filtering based on Node Values



```
deg <- net1 %v% "alldeg"
n2 <- get.inducedSubgraph(net1, which(deg > 1))
gplot(n2, displaylabels = TRUE)
```

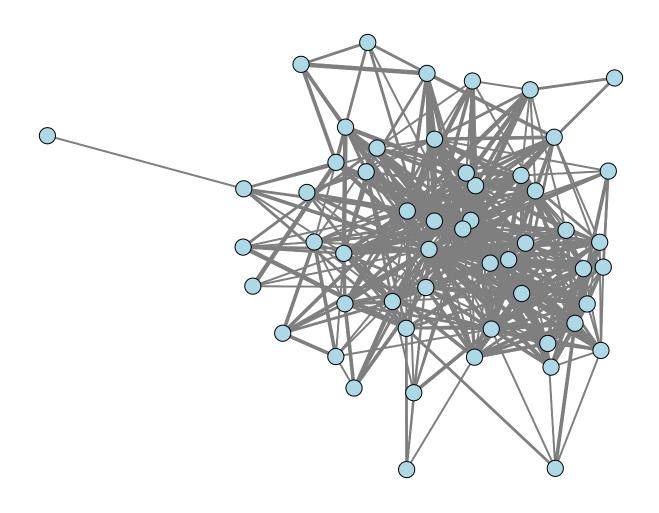


remove isolates

```
data("ICTS_G10")
summary(ICTS_G10, print.adj = FALSE )
## Network attributes:
##
     vertices = 493
##
     directed = FALSE
    hyper = FALSE
##
    loops = FALSE
##
    multiple = FALSE
##
##
    bipartite = FALSE
##
    title = G10_Pajek
## total edges = 1359
```

```
##
      missing edges = 0
##
      non-missing edges = 1359
##
   density = 0.01120566
##
## Vertex attributes:
##
##
  DiscCol:
      numeric valued attribute
##
      attribute summary:
##
##
      Min. 1st Qu. Median
                              Mean 3rd Qu.
                                               Max.
##
      1100
              3600
                      6500
                              5231
                                       6500
                                               8888
##
##
  DiscExp:
##
     numeric valued attribute
##
      attribute summary:
##
     Min. 1st Qu. Median
                              Mean 3rd Qu.
                                               Max.
##
     1100
              2800
                      6540
                              5067
                                       6910
                                               8888
##
     vertex.names:
##
      character valued attribute
      493 valid vertex names
##
##
##
  year:
     numeric valued attribute
##
##
      attribute summary:
##
     Min. 1st Qu. Median
                              Mean 3rd Qu.
                                               Max.
                                       2010
      2008
              2008
                      2009
                              2009
                                               2010
##
## No edge attributes
gden(ICTS_G10)
## [1] 0.01120566
length(isolates(ICTS_G10))
## [1] 96
n3 <- ICTS_G10
delete.vertices(n3, isolates(n3))
gden(n3)
## [1] 0.01728876
length(isolates(n3))
## [1] 0
filtering based on edge values
data("DHHS")
summary(DHHS, print.adj = FALSE )
## Network attributes:
##
     vertices = 54
##
     directed = FALSE
##
    hyper = FALSE
##
     loops = FALSE
```

```
multiple = FALSE
##
    bipartite = FALSE
##
## title = DHHS_Collab
## total edges = 447
     missing edges = 0
##
##
     non-missing edges = 447
## density = 0.312369
##
## Vertex attributes:
##
## agency:
##
     numeric valued attribute
##
     attribute summary:
##
   Min. 1st Qu. Median Mean 3rd Qu.
                                            Max.
## 0.000 2.000 6.500 5.185 7.000 10.000
##
    vertex.names:
##
     character valued attribute
##
     54 valid vertex names
##
## Edge attributes:
##
## collab:
##
     numeric valued attribute
     attribute summary:
## Min. 1st Qu. Median Mean 3rd Qu.
                                            Max.
## 1.000 1.000 2.000 2.199 3.000
                                           4.000
d <- DHHS
gden(d)
## [1] 0.312369
op \leftarrow par(mar = rep(0,4))
gplot(d,
     gmode = "graph",
     edge.lwd = d %e% 'collab',
     edge.col = "grey50",
     vertex.col = "lightblue",
     vertex.cex = 1.0,
     vertex.sides = 20)
```

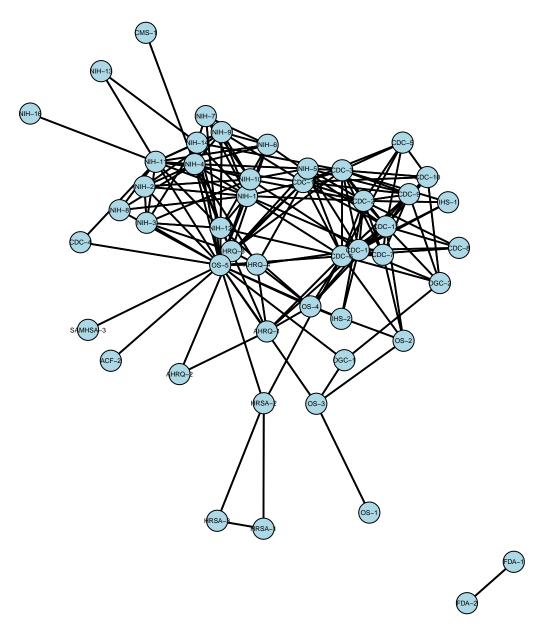


```
par(op)
as.sociomatrix(d)[1:6,1:6]
         ACF-1 ACF-2 AHRQ-1 AHRQ-2 AHRQ-3 AHRQ-4
##
## ACF-1
                1
                          0
                                 0
## ACF-2
                   0
                          0
                                 0
                                        0
                                               0
## AHRQ-1
                   0
                          0
                                 1
                                        1
                                               1
## AHRQ-2
             0
                   0
                                 0
                                        1
                                               1
                          1
## AHRQ-3
                          1
                                 1
## AHRQ-4
           0
                                 1
                                        1
                                               0
                   0
                          1
table(d %e% "collab")
##
```

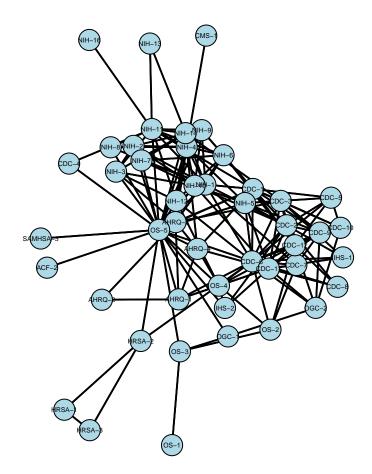
1 2 3 4

##

```
## 163 111 94 79
d.val <- as.sociomatrix(d, attrname = "collab")</pre>
d.val[d.val < 3] <- 0
d.filt <- as.network(d.val,</pre>
                     directed = FALSE,
                     matrix.type = "a",
                     ignore.eval = FALSE,
                     names.eval = "collab")
summary(d.filt, print.adj = FALSE)
## Network attributes:
##
   vertices = 54
##
     directed = FALSE
##
    hyper = FALSE
##
    loops = FALSE
##
    multiple = FALSE
##
   bipartite = FALSE
## total edges = 173
## missing edges = 0
##
   non-missing edges = 173
## density = 0.1208945
##
## Vertex attributes:
##
   vertex.names:
      character valued attribute
##
      54 valid vertex names
##
##
## Edge attributes:
##
## collab:
##
     numeric valued attribute
##
      attribute summary:
##
     Min. 1st Qu. Median Mean 3rd Qu.
                                              Max.
##
     3.000 3.000 3.000 3.457 4.000
                                             4.000
gden(d.filt)
## [1] 0.1208945
op \leftarrow par(mar = rep(0,4))
gplot(d.filt,
      gmode = "graph",
      displaylabels = TRUE,
      vertex.col = "lightblue",
      vertex.cex = 1.3,
     label.cex = 0.4,
     label.pos = 5,
      displayisolates = FALSE)
```







```
par(op)
```

transformining directed to non-directed network

```
net1symm <- network(net1mat,</pre>
                   matrix.type = "adjacency")
network.vertex.names(net1symm) <- c("A","B","C","D","E")</pre>
summary(net1symm)
## Network attributes:
##
    vertices = 5
    directed = TRUE
##
## hyper = FALSE
## loops = FALSE
## multiple = FALSE
## bipartite = FALSE
## total edges = 10
##
    missing edges = 0
##
    non-missing edges = 10
## density = 0.5
##
## Vertex attributes:
## vertex.names:
     character valued attribute
      5 valid vertex names
##
##
## No edge attributes
## Network adjacency matrix:
## A B C D E
## A O 1 1 O O
## B 1 0 1 1 0
## C 1 1 0 0 1
## D O 1 O O
```

E O O 1 O O