

# 11. Social Network Analysis

Code ▾

노드와 연결선으로 표현 가능한 관계형 데이터에 대해 사용가능한 분석기법

## Social Network MAP

노드와 엣지로 구성.

-> 크기, 두께 : 중요성, 관계의 정도.  
-> 엣지: 방향성(전화를 거는 방향), 무방향성(Bipartite->Unipartite).

## SNA Graphing method in R.

```
1. plot( graph.edgelist( mat[start, end] )
2. gplot( relation matrix, )
```

## 사례1. 전화

String - Factorize - Integer

graph object

edgelist(X)

plot(tele.w,...)

```
options(warn = -1)
```

```
Warning message:
In strsplit(code, "\n", fixed = TRUE) :
  input string 1 is invalid in this locale
```

```
library(igraph)
```

이제 이 패키지에서 사용할 변수들을 지정합니다. 이 패키지에서 사용할 변수들을 지정합니다: `igraph` 패키지에서

The following objects are masked from `igraph::stats`:

```
decompose, spectrum
```

The following object is masked from `igraph::base`:

```
union
```

```
getwd()
```

```
[1] "C:/Users/wiseo/Desktop/All_Bio"
```

```
tele <- read.csv('./머신러닝_독자제공용자료모음/Practice/tele.csv', header = FALSE)
head(tele)
```

```
levels_all <- union(levels(tele$V1) , levels(tele$V2))
tele$from <- factor(tele$V1 , levels = levels_all)
tele$to <- factor(tele$V2 , levels = levels_all)
tele$from2 <- as.integer(tele$from)
tele$to2 <- as.integer(tele$to)
tele_mat <- cbind(from = tele$from2 , to = tele$to2 , cnt = tele$V3)
tele_mat
```

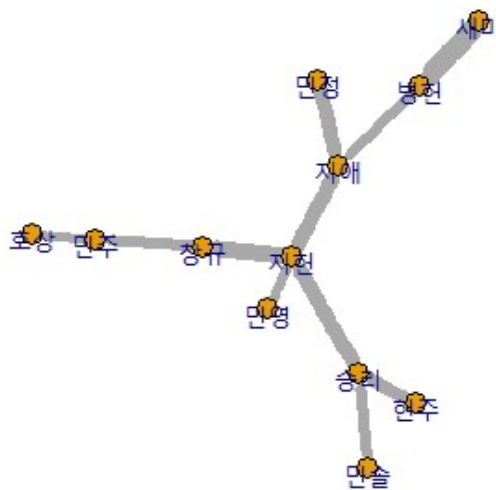
```
      from to cnt
[1,]    4  8 10
[2,]    8  4  6
[3,]    4 10  8
[4,]    6  4 12
[5,]    1  6  7
[6,]    6  1  6
[7,]    6  5 10
[8,]    5  6 12
[9,]    5  3  8
[10,]   3 12 19
[11,]   5 11 13
[12,]   6  7  9
[13,]   7  6 14
[14,]   2  7  9
[15,]   2  9  6
[16,]   9  2  4
```

```
tele.w <- graph.edgelist(tele_mat[,1:2])
E(tele.w)$weight <- tele_mat[,3]
str(tele.w)
```

```
IGRAPH D-W- 12 16 --
+ attr: weight (e/n)
+ edges:
  [1] 4-> 8 8-> 4 4->10 6-> 4 1-> 6 6-> 1 6-> 5 5-> 6 5-> 3 3->12 5->11 6->
  7 7-> 6 2-> 7 2-> 9
 [16] 9-> 2
```

```
tele.diag <- rep(0,16) + 5
tele.name <- levels_all
tele
```

```
#Does not work.
# plot(tele.w,
#       vertex.size=10,vertex.shape="circle",vertex.size=tele.diag,
#       vertex.label=tele.name,vertex.label.font=1,
#       vertex.label.cex=1+sqrt(tele.diag)/15,
#       edge.width=2+E(tele.w)$weight/2, edge.arrow.width= E(tele.w)$weight/5
# 0)
plot(tele.w,
     vertex.size=10,vertex.shape="circle",vertex.size=tele.diag,
     vertex.label=tele.name,vertex.label.font=1,
     vertex.label.cex=1+sqrt(tele.diag)/15,
     edge.width=2+tele_mat[,3]/2, edge.arrow.width= tele_mat[,3]/50)
```



# 메일 관계

## String - Factorize - Integer

Graph object(edgelist matrix) : email.w

plot(email.w,...)

```
email <- read.csv("../머신러닝_독자제공용자료모음/Practice/email.csv",header=F)
```

Warning message:

```
In strsplit(code, "\n", fixed = TRUE) :  
  input string 1 is invalid in this locale
```

```
levels_all <- union(levels(email$V1) , levels(email$V2))  
email$from <- factor(email$V1 , levels = levels_all)  
email$to <- factor(email$V2 , levels = levels_all)  
email$from2 <- as.integer(email$from)  
email$to2 <- as.integer(email$to)  
email_mat <- cbind(from = email$from2 , to = email$to2 , cnt = email$V3)  
email
```

```
email_mat
```

```
      from to cnt  
[1,]     6  4   3  
[2,]     4 10   7  
[3,]     1  6   6  
[4,]     6  1   3  
[5,]     6  5   9  
[6,]     5  6  10  
[7,]     8  4   3  
[8,]     4  8   9  
[9,]     6  7   7  
[10,]    7  6   4  
[11,]     2  7   2  
[12,]     2  9   7  
[13,]     9  2   8  
[14,]     5  3   3  
[15,]     3 12  10  
[16,]     5 11  11
```

```
email.w <- graph.edgelist(email_mat[,1:2])  
E(email.w)$weight <- email_mat[,3]  
str(email.w)
```

```

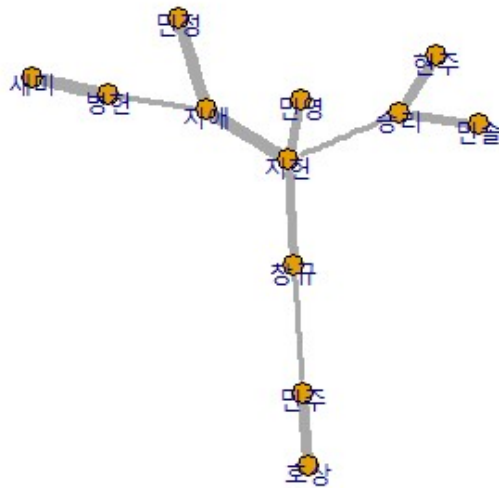
IGRAPH D-W- 12 16 --
+ attr: weight (e/n)
+ edges:
  [1] 6-> 4 4->10 1-> 6 6-> 1 6-> 5 5-> 6 8-> 4 4-> 8 6-> 7 7-> 6 2-> 7 2->
  9 9-> 2 5-> 3 3->12
  [16] 5->11

```

```

email.diag <- rep(0,16) + 5
email.name <- levels_all
plot(email.w,
      vertex.size=10,vertex.shape="circle",vertex.size=email.diag,
      vertex.label=email.name,vertex.label.font=1,
      vertex.label.cex=1+sqrt(email.diag)/15,
      edge.width=2+email_mat[,3]/2, edge.arrow.width= email_mat[,3]/50)

```



## Bipartite Network

도서구입관계

Bipartite Network.

## x, y축의 모든 요소를 하나의 축으로 가지는 Matrix.

```
#BOOK
book <- read.csv("../머신러닝_독자제공용자료모음/Practice/book.csv", header=T, stringsAsFactors = F)
```

```
Warning message:
In strsplit(code, "\n", fixed = TRUE) :
  input string 1 is invalid in this locale
```

```
book
```

```
book[is.na(book)] = 0
book
```

```
rownames(book) <- book[,1]
book <- book[-1]
book
```

```
book_mat <- as.matrix(book)
n <- nrow(book_mat)
m <- ncol(book_mat)
book_mat2 <- rbind(cbind(matrix(0,n,n),book_mat),cbind(t(book_mat),matrix(0,
m,m))))
```

```
library(sna)
```

```

# Load the network package
library(network)
# Load the sna package
library(sna)
# Create a network
g <- graph_undirected(10, 0.1)
# Calculate the degree of each node
deg <- degree(g)
# Print the degree of each node
print(deg)

```

```

# Create a network
g <- graph_undirected(10, 0.1)
# Calculate the degree of each node
deg <- degree(g)
# Print the degree of each node
print(deg)

```

```

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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.

```

```

# Create a network
g <- graph_undirected(10, 0.1)
# Calculate the degree of each node
deg <- degree(g)
# Print the degree of each node
print(deg)

```

```

The following objects are masked from 'package:igraph':

```

```

%c%, %s%, add.edges, add.vertices, delete.edges, delete.vertices,
get.edge.attribute, get.edges, get.vertex.attribute, is.bipartite, is.direc
ted,
list.edge.attributes, list.vertex.attributes, set.edge.attribute,
set.vertex.attribute

```

```

sna: Tools for Social Network Analysis

```

```

Version 2.4 created on 2016-07-23.

```

```

copyright (c) 2005, Carter T. Butts, University of California-Irvine

```

```

For citation information, type citation("sna").

```

```

Type help(package="sna") to get started.

```

```

# Create a network
g <- graph_undirected(10, 0.1)
# Calculate the degree of each node
deg <- degree(g)
# Print the degree of each node
print(deg)

```

```

The following objects are masked from 'package:igraph':

```

```

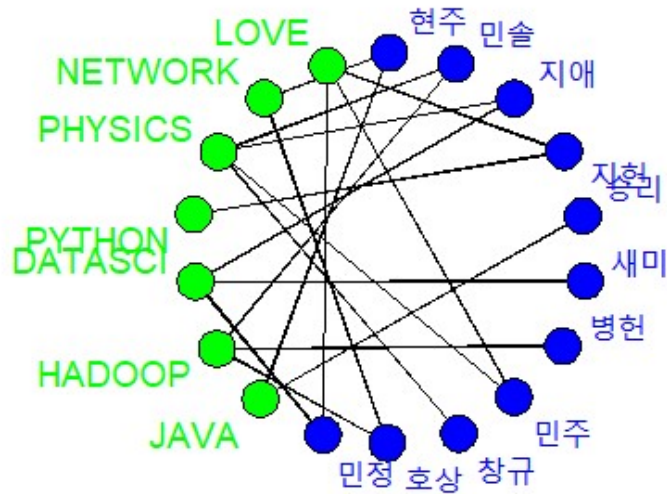
betweenness, bonpow, closeness, components, degree, dyad.census, evcent,
hierarchy, is.connected, neighborhood, triad.census

```

```

vertex.col <- c(rep("blue",n),rep("green",m))
vertex.cex <- c(rep(2,n),rep(2,m))
gplot(book_mat2, mode="circle", displaylabels=T, boxed.labels=F,
      vertex.col=vertex.col, vertex.cex=vertex.cex,
      label.col=vertex.col, label.cex=1.2, usearrows=F)

```



Bipartite -> Unipartite(구입자간 관계도)

Squares of Density

ex) 현주{books} \* {books} 현주

Diag : 자신이 산 책수의 제곱합

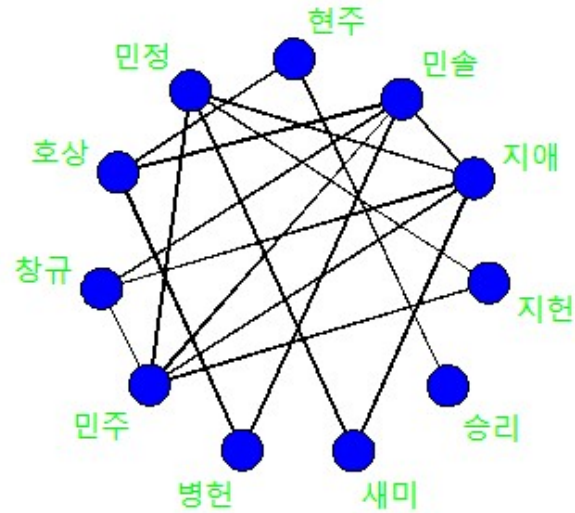
반대로 책들간 관계도 가능

ex) Hadoop {구입자} \* {구입자} Hadoop

Density (in == out)

```
#book_mat
#
book_mat3 <- book_mat %*% t(book_mat)
#book_mat3
diag(book_mat3) <- rep(0 , dim(book_mat3)[1])
book_mat3[book_mat3 > 0] <- 1
#book_mat3
gplot(book_mat3, mode="circle", displaylabels=T, boxed.labels=F,
      vertex.col="blue", vertex.cex=2,
      label.col="green", label.cex=1.2, usearrows=F)
```





```
#Network matrix connecting from M(i,j) : connectivity of (i-j th node element)
rownames(book_mat3)
```

```
[1] "현주" "민술" "지애"
1, 지현" "승리" "새미" "병헌" "민주" "창규" "호상" "민정"
```

```
degree(book_mat3) #Undirected, Without in/out degree
```

```
[1] 4 10 10 4 2 4 4 10 6 6 8
```

```
degree(book_mat3 , cmode ="indegree")
```

```
[1] 2 5 5 2 1 2 2 5 3 3 4
```

```
degree(book_mat3 , cmode ="outdegree")
```

```
[1] 2 5 5 2 1 2 2 5 3 3 4
```

```
#Density and Reacheability of each node
gden(book_mat3) #Find Graph density
```

```
[1] 0.3090909
```

```
reachability(book_mat3)
```

```
Node 1, Reach 11, Total 11
Node 2, Reach 11, Total 22
Node 3, Reach 11, Total 33
Node 4, Reach 11, Total 44
Node 5, Reach 11, Total 55
Node 6, Reach 11, Total 66
Node 7, Reach 11, Total 77
Node 8, Reach 11, Total 88
Node 9, Reach 11, Total 99
Node 10, Reach 11, Total 110
Node 11, Reach 11, Total 121
```

	[,1]	[,2]	[,3]	[,4]	[,5]	[,6]	[,7]	[,8]	[,9]	[,10]	[,11]
[1,]	1	1	1	1	1	1	1	1	1	1	1
[2,]	1	1	1	1	1	1	1	1	1	1	1
[3,]	1	1	1	1	1	1	1	1	1	1	1
[4,]	1	1	1	1	1	1	1	1	1	1	1
[5,]	1	1	1	1	1	1	1	1	1	1	1
[6,]	1	1	1	1	1	1	1	1	1	1	1
[7,]	1	1	1	1	1	1	1	1	1	1	1
[8,]	1	1	1	1	1	1	1	1	1	1	1
[9,]	1	1	1	1	1	1	1	1	1	1	1
[10,]	1	1	1	1	1	1	1	1	1	1	1
[11,]	1	1	1	1	1	1	1	1	1	1	1

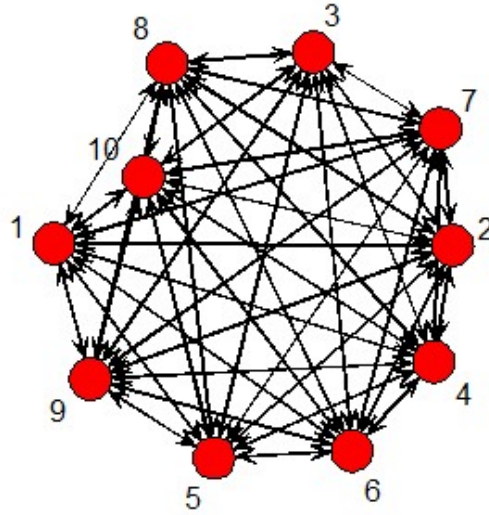
## 네트워크 용어

### Component

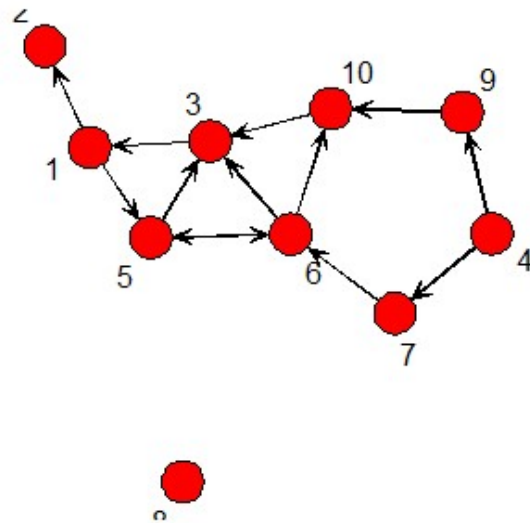
-> 각각의 노드들이 닿을 수 있는 노드리스트의 세트?

```
In strsplit(code, "\n", fixed = TRUE) :
  input string 1 is invalid in this locale
```

```
yang_1 <- rgraph(10 , tprob = 1)
gplot(yang_1 , displaylabels = T , boxed.labels = F , vertex.cex = 2)
```



```
yang_03 <- rgraph(10, tprob = 0.2)
gplot(yang_03, displaylabels = T, boxed.labels = F, vertex.cex = 2)
```



```
components(yang_03)
```

```
Node 1, Reach 6, Total 6
Node 2, Reach 1, Total 7
Node 3, Reach 6, Total 13
Node 4, Reach 9, Total 22
Node 5, Reach 6, Total 28
Node 6, Reach 6, Total 34
Node 7, Reach 7, Total 41
Node 8, Reach 1, Total 42
Node 9, Reach 7, Total 49
Node 10, Reach 6, Total 55
[1] 6
```

```
component.dist(yang_03)
```

```
Node 1, Reach 6, Total 6
Node 2, Reach 1, Total 7
Node 3, Reach 6, Total 13
Node 4, Reach 9, Total 22
Node 5, Reach 6, Total 28
Node 6, Reach 6, Total 34
Node 7, Reach 7, Total 41
Node 8, Reach 1, Total 42
Node 9, Reach 7, Total 49
Node 10, Reach 6, Total 55
$membership
 [1] 1 2 1 3 1 1 4 5 6 1

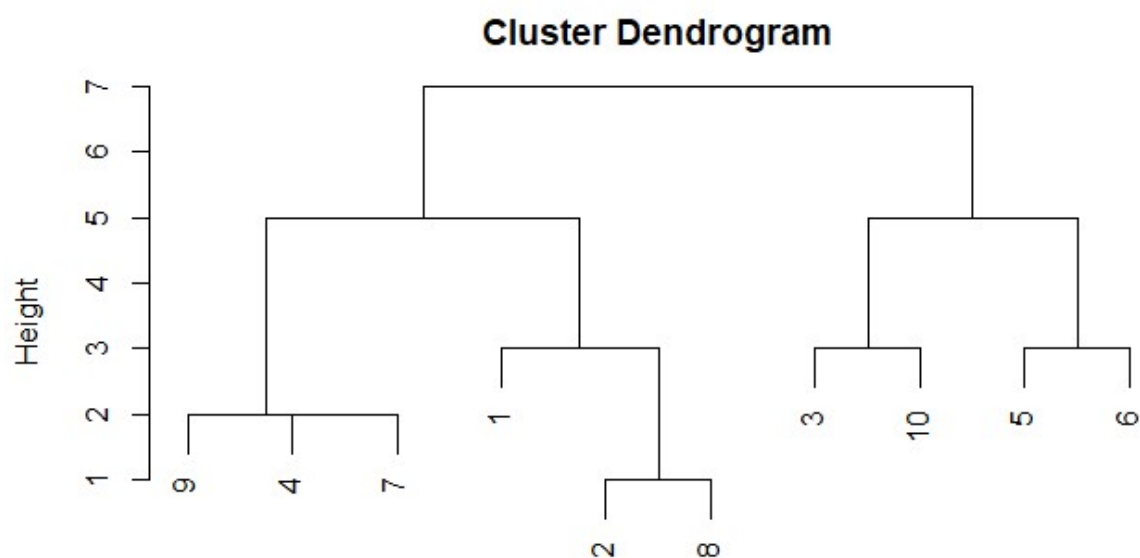
$csizes
 [1] 5 1 1 1 1 1 1

$cdists
 [1] 5 0 0 0 1 0 0 0 0 0
```

```
#Hamming Distance of Sub-Graphs (?)
sedist(yang_03 , method = "hamming")
```

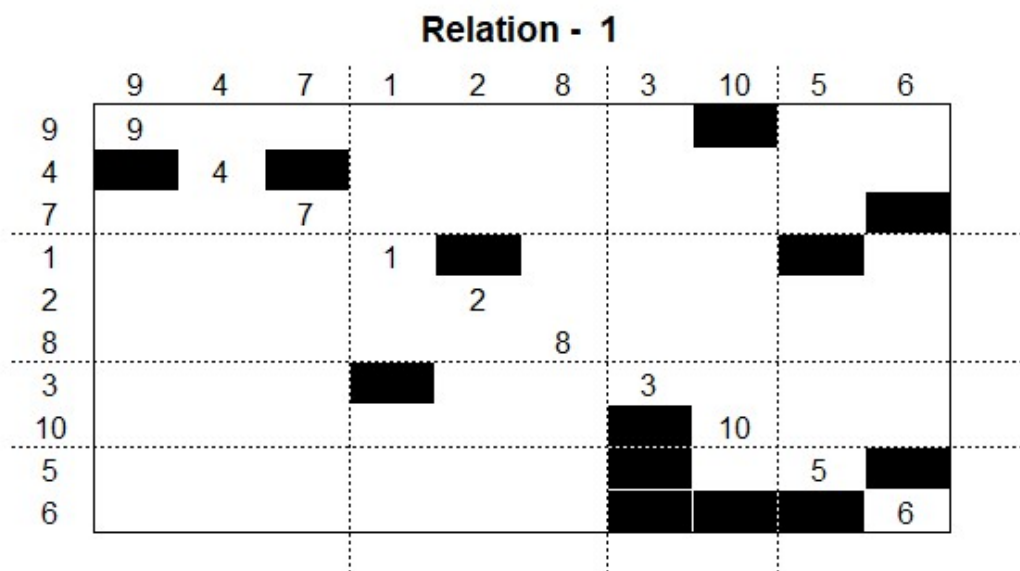
	[,1]	[,2]	[,3]	[,4]	[,5]	[,6]	[,7]	[,8]	[,9]	[,10]
[1,]	0	2	5	5	5	6	5	3	5	6
[2,]	2	0	5	3	3	6	3	1	3	4
[3,]	5	5	0	6	4	5	6	4	6	3
[4,]	5	3	6	0	6	7	2	2	2	5
[5,]	5	3	4	6	0	3	4	4	6	3
[6,]	6	6	5	7	3	0	5	5	5	4
[7,]	5	3	6	2	4	5	0	2	2	5
[8,]	3	1	4	2	4	5	2	0	2	3
[9,]	5	3	6	2	6	5	2	2	0	3
[10,]	6	4	3	5	3	4	5	3	3	0

```
cluster_03 <- equiv.clust(yang_03 , method = "hamming" , cluster.method = "complete")
plot(cluster_03)
```



```
as.dist(equiv.dist)
hclust (*, "complete")
```

```
bplot <- blockmodel(yang_03 , cluster_03 , h = 3)
plot(bplot)
```



```
bplot
```

Network Blockmodel:

Block membership:

```
1  2  3  4  5  6  7  8  9 10
1  1  2  3  4  4  3  1  3  2
```

Reduced form blockmodel:

	Block 1	Block 2	Block 3	Block 4
Block 1	0.1666667	0.0000000	0.0000000	0.1666667
Block 2	0.1666667	0.5000000	0.0000000	0.0000000
Block 3	0.0000000	0.1666667	0.3333333	0.1666667
Block 4	0.0000000	0.7500000	0.0000000	1.0000000

yang\_03

	[,1]	[,2]	[,3]	[,4]	[,5]	[,6]	[,7]	[,8]	[,9]	[,10]
[1,]	0	1	0	0	1	0	0	0	0	0
[2,]	0	0	0	0	0	0	0	0	0	0
[3,]	1	0	0	0	0	0	0	0	0	0
[4,]	0	0	0	0	0	0	1	0	1	0
[5,]	0	0	1	0	0	1	0	0	0	0
[6,]	0	0	1	0	1	0	0	0	0	1
[7,]	0	0	0	0	0	1	0	0	0	0
[8,]	0	0	0	0	0	0	0	0	0	0
[9,]	0	0	0	0	0	0	0	0	0	1
[10,]	0	0	1	0	0	0	0	0	0	0

geodist(yang\_03)\$gdist

	[,1]	[,2]	[,3]	[,4]	[,5]	[,6]	[,7]	[,8]	[,9]	[,10]
[1,]	0	1	2	Inf	1	2	Inf	Inf	Inf	3
[2,]	Inf	0	Inf	Inf	Inf	Inf	Inf	Inf	Inf	Inf
[3,]	1	2	0	Inf	2	3	Inf	Inf	Inf	4
[4,]	4	5	3	0	3	2	1	Inf	1	2
[5,]	2	3	1	Inf	0	1	Inf	Inf	Inf	2
[6,]	2	3	1	Inf	1	0	Inf	Inf	Inf	1
[7,]	3	4	2	Inf	2	1	0	Inf	Inf	2
[8,]	Inf	Inf	Inf	Inf	Inf	Inf	Inf	0	Inf	Inf
[9,]	3	4	2	Inf	4	5	Inf	Inf	0	1
[10,]	2	3	1	Inf	3	4	Inf	Inf	Inf	0

closeness(book\_mat3)

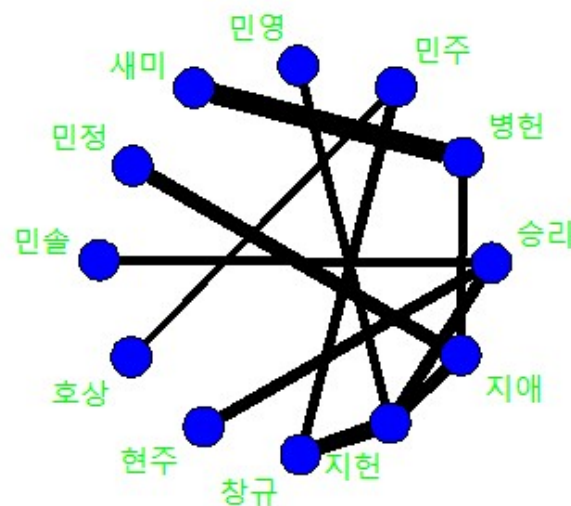
```
[1] 0.3703704 0.6250000 0.5555556 0.4000000 0.2777778 0.4000000 0.4545455
0.5555556 0.5000000
[10] 0.5000000 0.4347826
```

```
rownames(book_mat3)[which.max(closeness(book_mat3))]
```

```
[1] "민솔"
```

```
Warning message:
In strsplit(code, "\n", fixed = TRUE) :
  input string 1 is invalid in this locale
```

```
tele_mat2 <- matrix(0 , 12 , 12)
#Convert into relation matrix
# == # tele_mat2[tele_mat[,1:2]] <- 1
for(i in 1:16) {
  tele_mat2[as.integer(tele_mat[i,][1]) , as.integer(tele_mat[i,][2])] = as.
integer(tele_mat[i,][3])
}
#Naming with factor levels ? random leveling?
rownames(tele_mat2) <- union(levels(tele$V1) , levels(tele$V2))
colnames(tele_mat2) <- union(levels(tele$V1) , levels(tele$V2))
#tele_mat2
gplot(tele_mat2, mode="circle", displaylabels=T, boxed.labels=F,
      vertex.col="blue", vertex.cex=2, edge.lwd = tele_mat2 ,
      label.col="green", label.cex=1.2, usearrows=F)
```



# 연계중심성(Betweenness Centrality)

Edge의 중심성 (임의의 노드간 거리에서 edge를 거치는 빈도)

## 아이겐벡터(Eigen vector Centrality)

중심성 높은 노드들간 연계

```
options(warn = FALSE)
#Indicate only connectivity.
tele_mat2[tele_mat2 > 0] <- 1
#tele_mat2
#Betweenness Centrality
betweenness(tele_mat2)
```

```
[1] 0 10 6 13 15 37 18 0 0 0 0 0
```

```
#Get Index of Maximum betweenness Centrality
#rownames(tele_mat2)[which.max(betweenness(tele_mat2))]
#Eigenvector Centrality
#round(evcent(tele_mat2) , 3)
#round(evcent(t(tele_mat2)) , 3)
#Manual Eigenvector Calculations
#abs(eigen(tele_mat2)$vectors[,1])
#rownames(tele_mat2)[which.max(abs(eigen(tele_mat2)$vectors[,1]))]
```

```
In strsplit(code, "\n", fixed = TRUE) :
input string 1 is invalid in this locale
```

```
email_mat2[email_mat[,1:2]] <- 1
rownames(email_mat2) <- email.name
colnames(email_mat2) <- email.name
```

```
#email_mat2
#getwd()
```

Add a new chunk by clicking the *Insert Chunk* button on the toolbar or by pressing *Ctrl+Alt+I*.

When you save the notebook, an HTML file containing the code and output will be saved alongside it (click the *Preview* button or press *Ctrl+Shift+K* to preview the HTML file).