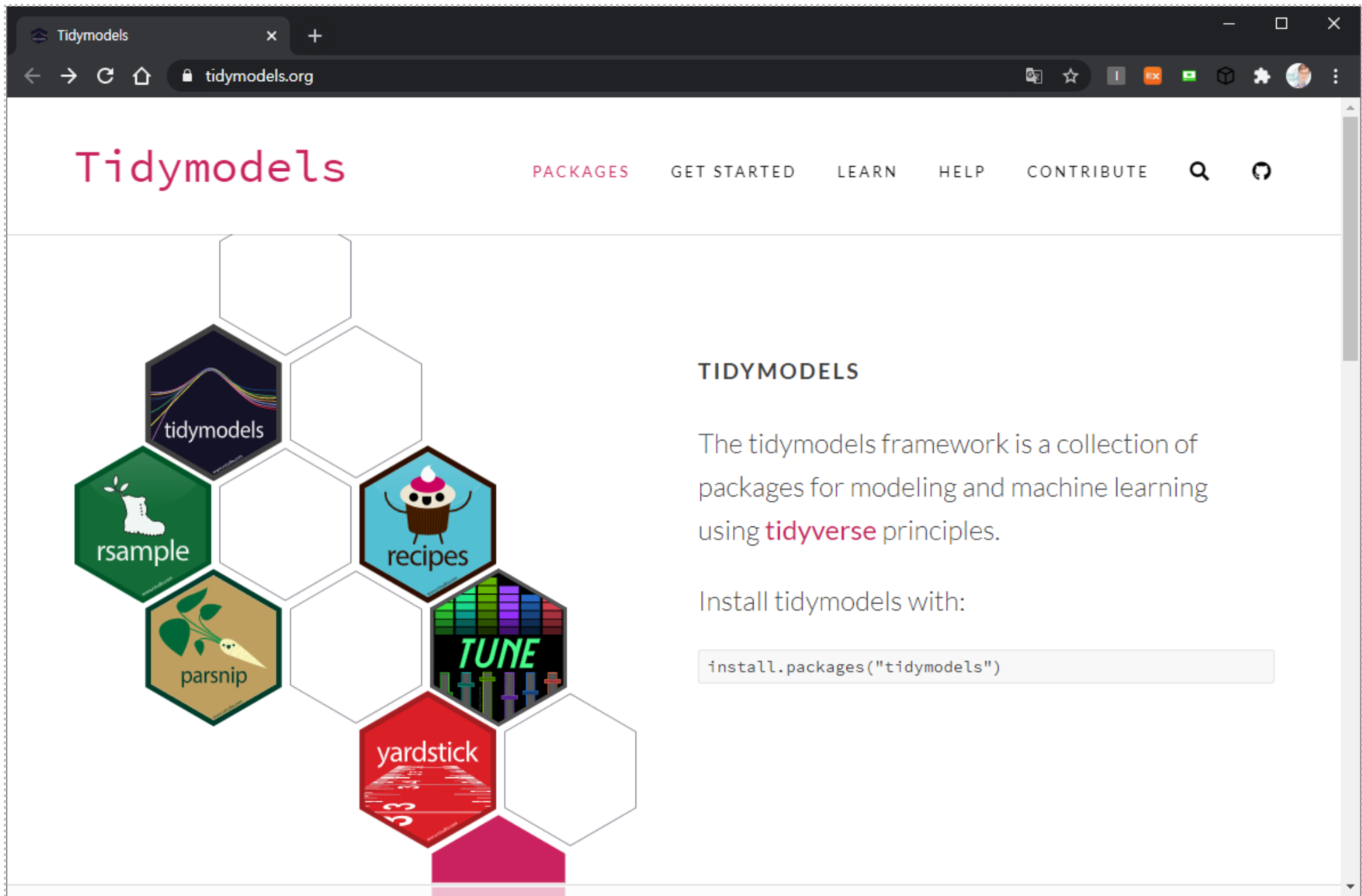


Ch10.연관규칙



The screenshot shows the Tidymodels website in a web browser. The browser's address bar displays 'tidymodels.org'. The website's header features the 'Tidymodels' logo in pink, followed by navigation links: 'PACKAGES', 'GET STARTED', 'LEARN', 'HELP', and 'CONTRIBUTE'. Search and GitHub icons are also present. The main content area on the left displays a cluster of hexagonal icons for various packages: 'tidymodels' (dark blue with a line graph), 'rsample' (green with a boot), 'parsnip' (tan with a leaf), 'recipes' (light blue with a cupcake), 'TUNE' (black with a colorful bar chart), and 'yardstick' (red with a ruler). The right side of the page has the heading 'TIDYMODELS' and a paragraph: 'The tidymodels framework is a collection of packages for modeling and machine learning using **tidyverse** principles.' Below this, it says 'Install tidymodels with:' followed by a code block containing the R command:

```
install.packages("tidymodels")
```

Tidymodels

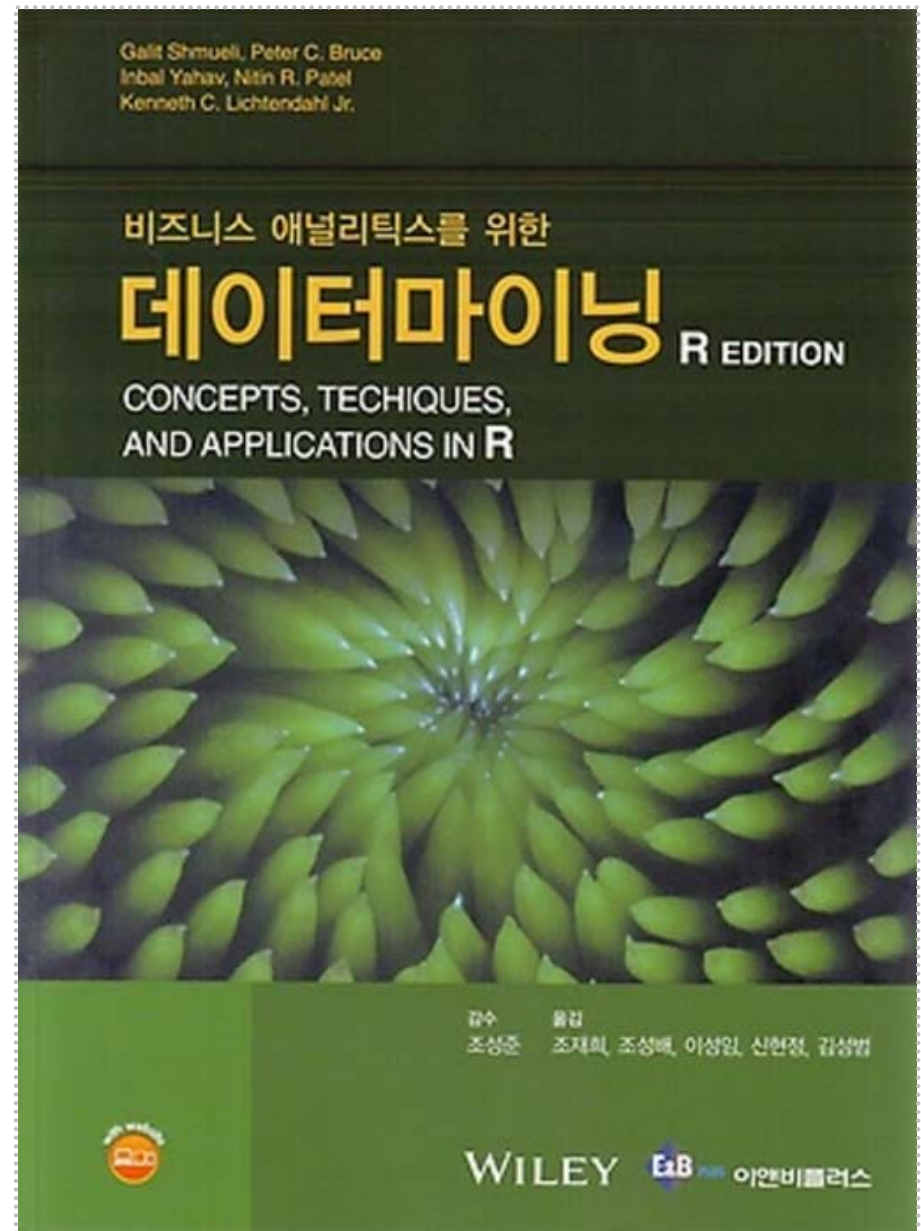
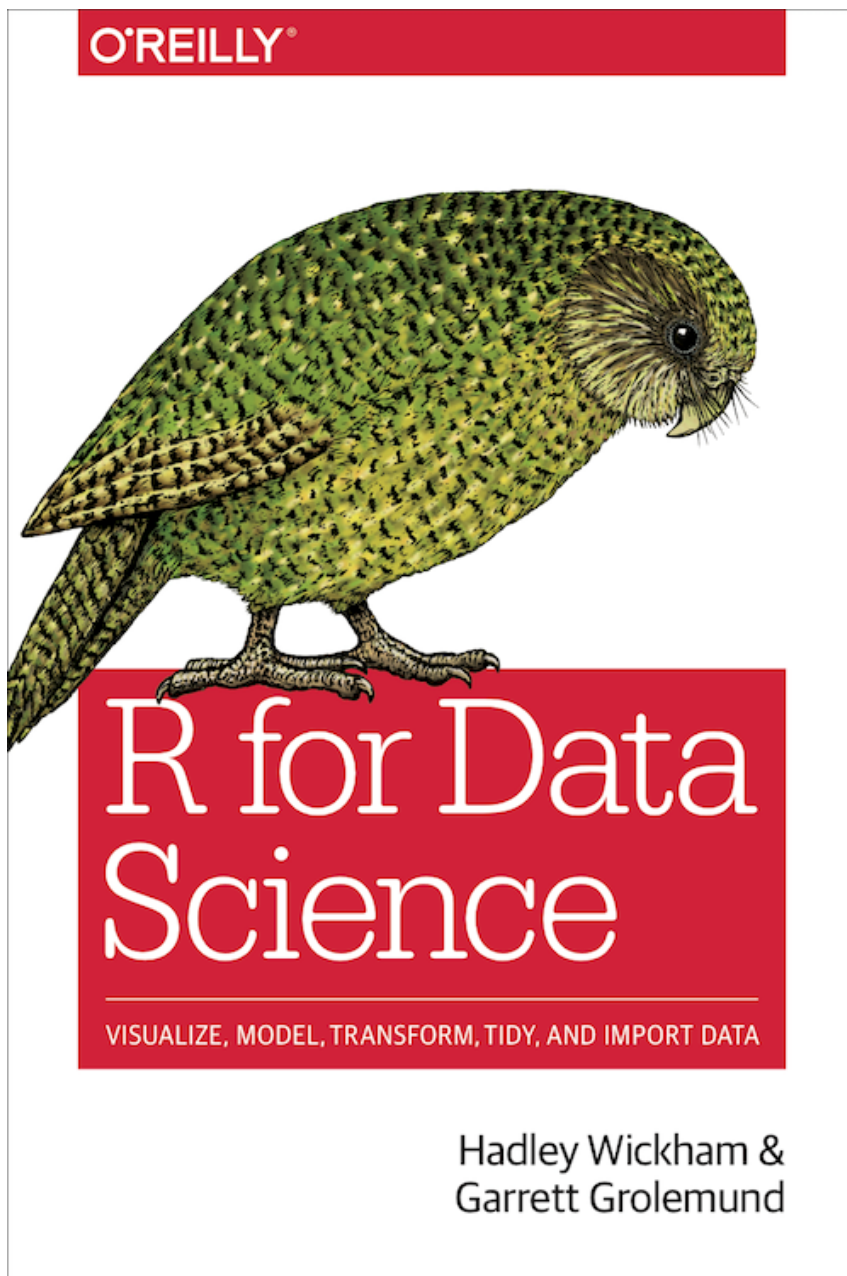
PACKAGES GET STARTED LEARN HELP CONTRIBUTE

TIDYMODELS

The tidymodels framework is a collection of packages for modeling and machine learning using **tidyverse** principles.

Install tidymodels with:

```
install.packages("tidymodels")
```



학습목표

- R 프로그래밍 실습
- 실습: 복클립 사례

북까페 사례

데이터 형식

- 찰스 북클럽 사례
 - 4,000 거래
 - ChildBks: 어린이 (제거)
 - YouthBks: 청소년
 - CookBks: 요리 등

TABLE 14.7 SUBSET OF BOOK PURCHASE TRANSACTIONS IN BINARY MATRIX FORMAT

ChildBks	YouthBks	CookBks	DoItYBks	cefBks	ArtBks	GeogBks	ItalCook	ItalAtlas	ItalArt	Florence
0	1	0	1	0	0	1	0	0	0	0
1	0	0	0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0	0	0	0
1	1	1	0	1	0	1	0	0	0	0
0	0	1	0	0	0	1	0	0	0	0
1	0	0	0	0	1	0	0	0	0	1
0	1	0	0	0	0	0	0	0	0	0
0	1	0	0	1	0	0	0	0	0	0
1	0	0	1	0	0	0	0	0	0	0
1	1	1	0	0	0	1	0	0	0	0
0	0	0	0	0	0	0	0	0	0	0

Package 설치

연관분석: Table 15.9

#####

tidyverse: ggplot2, purrr, tibble 3.0.3,

dplyr, tidyr, stringr, readr, forcats

#

#####

install.packages("tidyverse")

install.packages("arules")

library(tidyverse)

library(arules)

Package 설치

```
Console Terminal Jobs
C:/Users/leecho/Desktop/R-DM/Ch10.연관규칙/
> # install.packages("tidyverse")
> # install.packages("arules")
> library(tidyverse)
-- Attaching packages ----- tidyverse 1.3.0 --
√ ggplot2 3.3.2    √ purrr  0.3.4
√ tibble  3.0.4    √ dplyr  1.0.2
√ tidyr   1.1.2    √ stringr 1.4.0
√ readr   1.4.0    √ forcats 0.5.0
-- Conflicts ----- tidyverse_conflicts() --
x dplyr::filter() masks stats::filter()
x dplyr::lag()     masks stats::lag()
경고메시지(들):
1: 패키지 'tidyverse'는 R 버전 4.0.3에서 작성되었습니다
2: 패키지 'ggplot2'는 R 버전 4.0.3에서 작성되었습니다
3: 패키지 'tibble'는 R 버전 4.0.3에서 작성되었습니다
4: 패키지 'tidyr'는 R 버전 4.0.3에서 작성되었습니다
5: 패키지 'readr'는 R 버전 4.0.3에서 작성되었습니다
6: 패키지 'purrr'는 R 버전 4.0.3에서 작성되었습니다
7: 패키지 'dplyr'는 R 버전 4.0.3에서 작성되었습니다
8: 패키지 'stringr'는 R 버전 4.0.3에서 작성되었습니다
9: 패키지 'forcats'는 R 버전 4.0.3에서 작성되었습니다
> library(arules)
필요한 패키지를 로딩중입니다: Matrix

다음의 패키지를 부착합니다: 'Matrix'

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

  expand, pack, unpack

다음의 패키지를 부착합니다: 'arules'

The following object is masked from 'package:dplyr':

  recode
```


01.데이터 불러오기

```
# 01.데이터 불러오기
```

```
book_tb <- read_csv('CharlesBookClub.csv',  
                    col_names = TRUE,  
                    locale=locale('ko', encoding='euc-kr'),  
                    na=".") %>% # csv 데이터 읽어오기  
mutate_if(is.character, as.factor)
```

```
str(book_tb)
```

```
head(book_tb)
```

01.데이터 불러오기

```
Console Terminal Jobs
C:/Users/leecho/Desktop/R-DM/Ch10.연관규칙/
> # 01.데이터 불러오기
> book_tb <- read_csv('CharlesBookClub.csv',
+                     col_names = TRUE,
+                     locale=locale('ko', encoding='euc-kr'),
+                     na=".") %>% # csv 데이터 읽어오기
+ mutate_if(is.character, as.factor)

-- Column specification -----
cols(
  .default = col_double()
)
i Use spec() for the full column specifications.

> str(book_tb)
tibble [4,000 x 24] (S3: spec_tbl_df/tbl_df/tbl/data.frame)
 $ Seq#      : num [1:4000] 1 2 3 4 5 6 7 8 9 10 ...
 $ ID#       : num [1:4000] 25 29 46 47 51 60 61 79 81 90 ...
 $ Gender    : num [1:4000] 1 0 1 1 1 1 1 1 1 1 ...
 $ M         : num [1:4000] 297 128 138 228 257 145 190 187 252 240 ...
 $ R         : num [1:4000] 14 8 22 2 10 6 16 14 10 6 ...
 $ F         : num [1:4000] 2 2 7 1 1 2 1 1 1 3 ...
 $ FirstPurch : num [1:4000] 22 10 56 2 10 12 16 14 10 20 ...
 $ ChildBks  : num [1:4000] 0 0 2 0 0 0 0 1 0 0 ...
 $ YouthBks  : num [1:4000] 1 0 1 0 0 0 0 0 0 0 ...
 $ CookBks   : num [1:4000] 1 0 2 0 0 0 0 0 0 1 ...
 $ DoItYBks  : num [1:4000] 0 0 0 0 0 0 0 0 0 0 ...
 $ RefBks    : num [1:4000] 0 0 1 0 0 0 0 0 0 0 ...
 $ ArtBks    : num [1:4000] 0 0 0 0 0 0 0 0 0 0 ...
 $ GeogBks   : num [1:4000] 0 0 1 0 0 0 1 0 0 0 ...
 $ ItalCook  : num [1:4000] 0 0 1 0 0 0 0 0 0 0 ...
 $ ItalAtlas : num [1:4000] 0 0 0 0 0 0 0 0 0 0 ...
 $ ItalArt   : num [1:4000] 0 0 0 0 0 0 0 0 0 0 ...
 $ Florence  : num [1:4000] 0 0 0 0 0 0 0 0 0 0 ...
 $ Related Purchase: num [1:4000] 0 0 2 0 0 0 1 0 0 0 ...
 $ Mcode     : num [1:4000] 5 4 4 5 5 4 4 4 5 5 ...
 $ Rcode     : num [1:4000] 4 3 4 1 3 2 4 4 3 2 ...
```

01.데이터 불러오기

```
Console Terminal Jobs
C:/Users/leecho/Desktop/R-DM/Ch10.연관규칙/

.. M = col_double(),
.. R = col_double(),
.. F = col_double(),
.. FirstPurch = col_double(),
.. ChildBks = col_double(),
.. YouthBks = col_double(),
.. CookBks = col_double(),
.. DoItYBks = col_double(),
.. RefBks = col_double(),
.. ArtBks = col_double(),
.. GeogBks = col_double(),
.. ItalCook = col_double(),
.. ItalAtlas = col_double(),
.. ItalArt = col_double(),
.. Florence = col_double(),
.. `Related Purchase` = col_double(),
.. Mcode = col_double(),
.. Rcode = col_double(),
.. Fcode = col_double(),
.. Yes_Florence = col_double(),
.. No_Florence = col_double()
.. )
> head(book_tb)
# A tibble: 6 x 24
  `Seq#` `ID#` Gender      M      R      F FirstPurch ChildBks YouthBks CookBks DoItYBks RefBks ArtBks GeogBks
  <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl>
1      1    25      1    297    14      2      22      0      1      1      0      0      0      0
2      2    29      0    128      8      2     10      0      0      0      0      0      0      0
3      3    46      1    138    22      7     56      2      1      2      0      1      0      1
4      4    47      1    228      2      1      2      0      0      0      0      0      0      0
5      5    51      1    257    10      1     10      0      0      0      0      0      0      0
6      6    60      1    145      6      2     12      0      0      0      0      0      0      0
# ... with 10 more variables: ItalCook <dbl>, ItalAtlas <dbl>, ItalArt <dbl>, Florence <dbl>, `Related
# Purchase` <dbl>, Mcode <dbl>, Rcode <dbl>, Fcode <dbl>, Yes_Florence <dbl>, No_Florence <dbl>
>
```

02.전리작업

02.전리작업: dataframe을 matrix 형식으로 변환

필요없는 변수 제거

```
book_count <-  
  book_tb %>%  
  select (c(8:18))
```

```
head(book_count)
```

1이상인 데이터를 1로 변환

matrix형태로 자동 변환

```
book_count <-  
  ifelse(book_count > 0, 1, 0)
```

```
head(book_count)
```

02. 전리작업

```
Console Terminal Jobs
C:/Users/leecho/Desktop/R-DM/Ch10.연관규칙/
> # 필요없는 변수 제거
> book_count <-
+   book_tb %>%
+   select (c(8:18))
> head(book_count)
# A tibble: 6 x 11
  ChildBks YouthBks CookBks DoItYBks RefBks ArtBks GeogBks ItalCook ItalAtlas ItalArt Florence
    <dbl>    <dbl>    <dbl>    <dbl>    <dbl>    <dbl>    <dbl>    <dbl>    <dbl>    <dbl>    <dbl>
1         0         1         1         0         0         0         0         0         0         0         0
2         0         0         0         0         0         0         0         0         0         0         0
3         2         1         2         0         1         0         1         1         0         0         0
4         0         0         0         0         0         0         0         0         0         0         0
5         0         0         0         0         0         0         0         0         0         0         0
6         0         0         0         0         0         0         0         0         0         0         0
> book_count <-
+   ifelse(book_count > 0, 1, 0)
> head(book_count)
  ChildBks YouthBks CookBks DoItYBks RefBks ArtBks GeogBks ItalCook ItalAtlas ItalArt Florence
[1,]         0         1         1         0         0         0         0         0         0         0         0
[2,]         0         0         0         0         0         0         0         0         0         0         0
[3,]         1         1         1         0         1         0         1         1         0         0         0
[4,]         0         0         0         0         0         0         0         0         0         0         0
[5,]         0         0         0         0         0         0         0         0         0         0         0
[6,]         0         0         0         0         0         0         0         0         0         0         0
> |
```

03.Transactions으로 변환

```
# 03.바이너리 코드를 transactions으로 변환
```

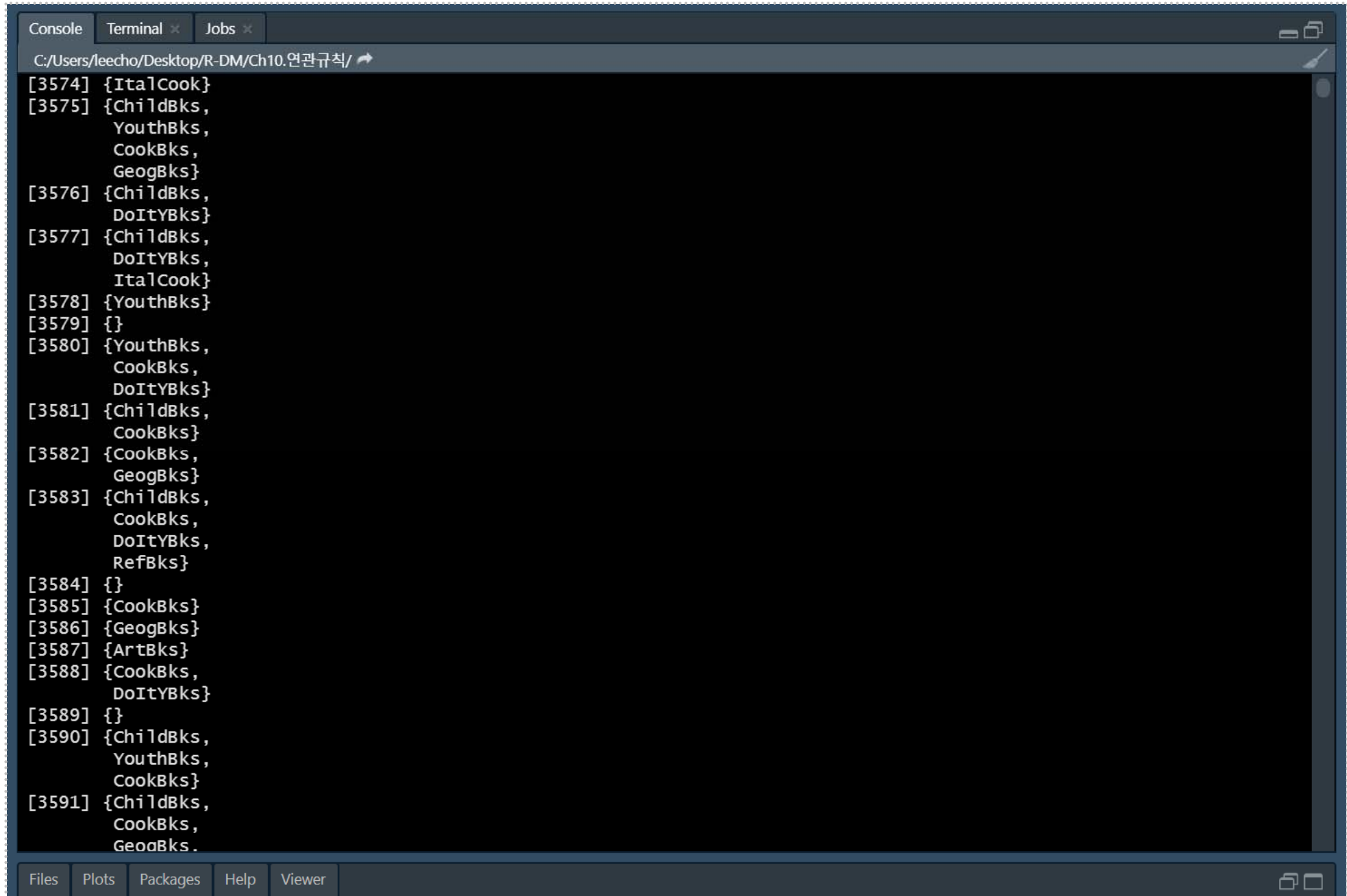
```
books_trans <-
```

```
  book_count %>%
```

```
  as("transactions")
```

```
inspect(books_trans)
```

03. Transactions으로 변환



```
C:/Users/leecho/Desktop/R-DM/Ch10.연관규칙/

[3574] {ItalCook}
[3575] {ChildBks,
      YouthBks,
      CookBks,
      GeogBks}
[3576] {ChildBks,
      DoItYBks}
[3577] {ChildBks,
      DoItYBks,
      ItalCook}
[3578] {YouthBks}
[3579] {}
[3580] {YouthBks,
      CookBks,
      DoItYBks}
[3581] {ChildBks,
      CookBks}
[3582] {CookBks,
      GeogBks}
[3583] {ChildBks,
      CookBks,
      DoItYBks,
      RefBks}
[3584] {}
[3585] {CookBks}
[3586] {GeogBks}
[3587] {ArtBks}
[3588] {CookBks,
      DoItYBks}
[3589] {}
[3590] {ChildBks,
      YouthBks,
      CookBks}
[3591] {ChildBks,
      CookBks,
      GeogBks}
```

04.연관규칙 실행

```
# 04.연관규칙 실행
```

```
# 그래프 확인
```

```
itemFrequencyPlot(books_trans,  
                  support = 0.1,  
                  topN = 30)
```

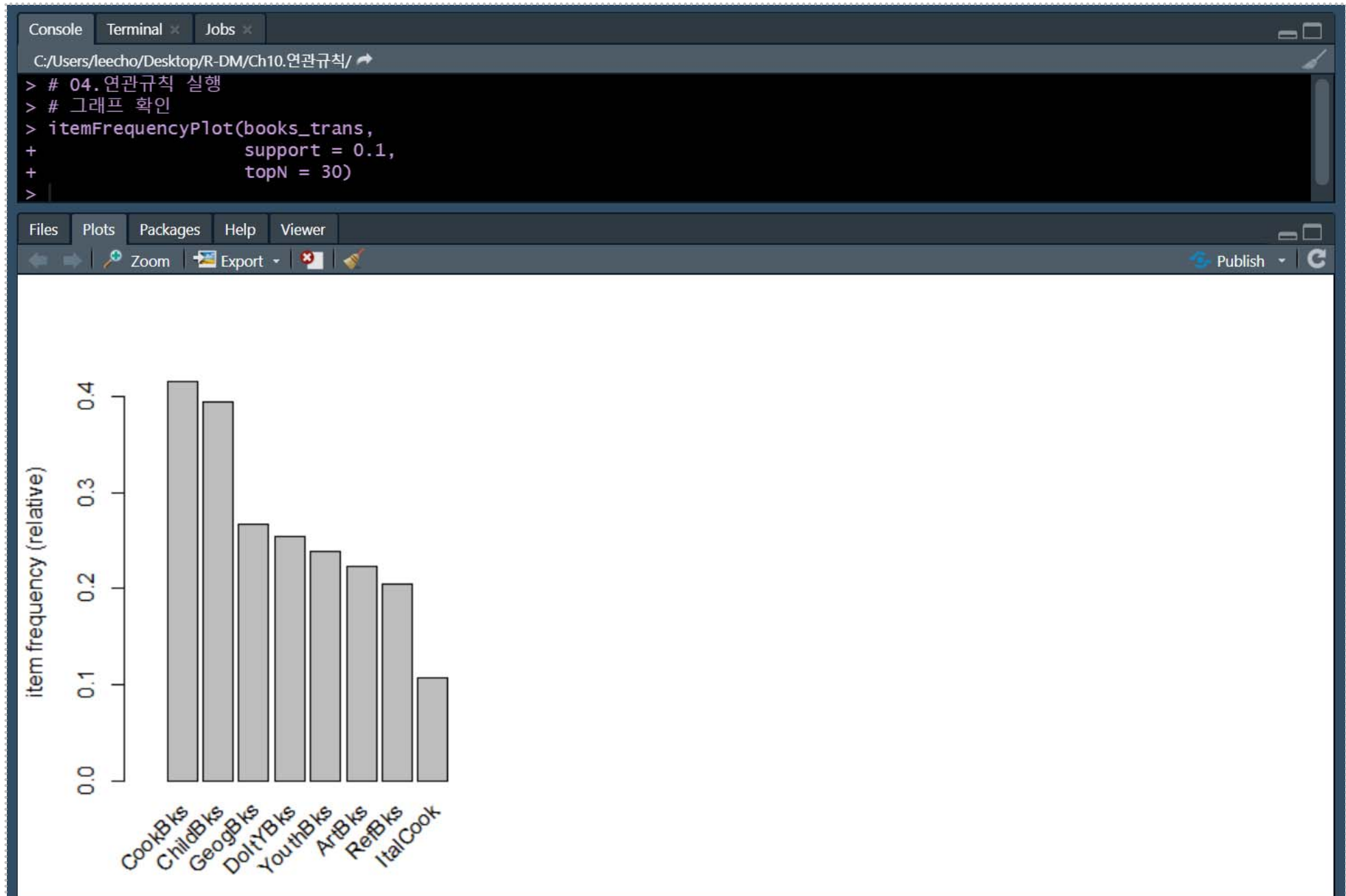
```
# apriori(data, minimum support, minimum confidence, and target)
```

```
books_rules <-
```

```
  apriori(books_trans,  
          parameter = list(supp= 200/4000,  
                           conf = 0.5,  
                           target = "rules"))
```

```
books_rules
```


04. 연관규칙 실행



04.연관규칙 실행

```
Console Terminal x Jobs x
C:/Users/leecho/Desktop/R-DM/Ch10.연관규칙/ ↗
> # apriori(data, minimum support, minimum confidence, and target)
> books_rules <-
+   apriori(books_trans,
+           parameter = list(supp= 200/4000,
+                             conf = 0.5,
+                             target = "rules"))
Apriori

Parameter specification:
confidence minval smax arem aval originalSupport maxtime support minlen maxlen target ext
          0.5   0.1   1 none FALSE                TRUE     5   0.05     1    10 rules TRUE

Algorithmic control:
filter tree heap memopt load sort verbose
  0.1 TRUE TRUE  FALSE TRUE    2    TRUE

Absolute minimum support count: 200

set item appearances ...[0 item(s)] done [0.00s].
set transactions ...[11 item(s), 4000 transaction(s)] done [0.00s].
sorting and recoding items ... [9 item(s)] done [0.00s].
creating transaction tree ... done [0.00s].
checking subsets of size 1 2 3 4 done [0.00s].
writing ... [72 rule(s)] done [0.00s].
creating S4 object ... done [0.00s].
> books_rules
set of 72 rules
> |
```

05. 연관규칙확인

```
# 05.규칙확인: lift가 높은 순서로 sorting
```

```
# rules을 테이블 형태로 저장
```

```
rules_tbl <-
```

```
  books_rules %>%
```

```
  inspect() %>%
```

```
  as_tibble(.name_repair = "unique")
```

```
str(rules_tbl)
```

```
# 특정 조건에 맞는 규칙 찾기
```

```
rules_tbl %>%
```

```
  arrange(desc(lift)) %>%
```

```
  filter (support >= 0.1,
```

```
          confidence >= 0.5,
```

```
          lift >= 1)
```

05. 연관규칙확인

```
Console Terminal Jobs
C:/Users/leecho/Desktop/R-DM/Ch10.연관규칙/
> # 05.규칙확인: lift가 높은 순서로 sorting
> # rules 확
> rules_tbl <-
+   books_rules %>%
+   inspect() %>%
+   as_tibble(.name_repair = "unique")
  lhs                rhs      support confidence coverage lift      count
[1] {ItalCook}        => {ChildBks} 0.06025 0.5604651 0.10750 1.422500 241
[2] {ItalCook}        => {CookBks} 0.06875 0.6395349 0.10750 1.539193 275
[3] {ArtBks}          => {CookBks} 0.11300 0.5067265 0.22300 1.219558 452
[4] {RefBks}          => {ChildBks} 0.12825 0.6263736 0.20475 1.589781 513
[5] {RefBks}          => {CookBks} 0.13975 0.6825397 0.20475 1.642695 559
[6] {YouthBks}        => {ChildBks} 0.14750 0.6190976 0.23825 1.571314 590
[7] {YouthBks}        => {CookBks} 0.16100 0.6757608 0.23825 1.626380 644
[8] {GeogBks}         => {ChildBks} 0.14625 0.5482662 0.26675 1.391538 585
[9] {GeogBks}         => {CookBks} 0.15625 0.5857545 0.26675 1.409758 625
[10] {DoItYBks}        => {ChildBks} 0.16150 0.6339549 0.25475 1.609022 646
[11] {DoItYBks}        => {CookBks} 0.16875 0.6624141 0.25475 1.594258 675
[12] {ChildBks}        => {CookBks} 0.24200 0.6142132 0.39400 1.478251 968
[13] {CookBks}         => {ChildBks} 0.24200 0.5824308 0.41550 1.478251 968
[14] {YouthBks,ArtBks} => {CookBks} 0.05150 0.7410072 0.06950 1.783411 206
[15] {ArtBks,GeogBks}  => {ChildBks} 0.05100 0.6276923 0.08125 1.593128 204
[16] {ArtBks,GeogBks}  => {CookBks} 0.05525 0.6800000 0.08125 1.636582 221
[17] {DoItYBks,ArtBks} => {ChildBks} 0.05375 0.7214765 0.07450 1.831159 215
[18] {ChildBks,ArtBks} => {DoItYBks} 0.05375 0.5106888 0.10525 2.004667 215
[19] {DoItYBks,ArtBks} => {CookBks} 0.05300 0.7114094 0.07450 1.712177 212
[20] {ChildBks,ArtBks} => {CookBks} 0.07325 0.6959620 0.10525 1.674999 293
[21] {CookBks,ArtBks}  => {ChildBks} 0.07325 0.6482301 0.11300 1.645254 293
[22] {YouthBks,RefBks} => {ChildBks} 0.06200 0.7630769 0.08125 1.936743 248
[23] {YouthBks,RefBks} => {CookBks} 0.06825 0.8400000 0.08125 2.021661 273
[24] {RefBks,GeogBks}  => {ChildBks} 0.05925 0.7247706 0.08175 1.839519 237
[25] {RefBks,GeogBks}  => {CookBks} 0.06450 0.7889908 0.08175 1.898895 258
[26] {DoItYBks,RefBks} => {ChildBks} 0.07100 0.7675676 0.09250 1.948141 284
[27] {ChildBks,RefBks} => {DoItYBks} 0.07100 0.5536062 0.12825 2.173135 284
[28] {DoItYBks,RefBks}  => {CookBks} 0.07450 0.8054054 0.09250 1.938400 298
[29] {CookBks,RefBks}   => {DoItYBks} 0.07450 0.5330948 0.13975 2.092619 298
```

05. 연관규칙확인

```
Console Terminal Jobs
C:/Users/leecho/Desktop/R-DM/Ch10.연관규칙/
> str(rules_tbl)
tibble [72 x 8] (S3: tbl_df/tbl/data.frame)
 $ lhs      : chr [1:72] "{ItalCook}" "{ItalCook}" "{ArtBks}" "{RefBks}" ...
 $ ...2     : chr [1:72] "=>" "=>" "=>" "=>" ...
 $ rhs      : chr [1:72] "{ChildBks}" "{CookBks}" "{CookBks}" "{ChildBks}" ...
 $ support   : num [1:72] 0.0602 0.0688 0.113 0.1283 0.1398 ...
 $ confidence: num [1:72] 0.56 0.64 0.507 0.626 0.683 ...
 $ coverage  : num [1:72] 0.107 0.107 0.223 0.205 0.205 ...
 $ lift      : num [1:72] 1.42 1.54 1.22 1.59 1.64 ...
 $ count     : int [1:72] 241 275 452 513 559 590 644 585 625 646 ...
>
```

05. 연관규칙확인

특정 조건에 맞는 규칙 찾기

```
rules_tbl %>%  
  arrange(desc(lift)) %>%  
  filter (support >= 0.1,  
         confidence >= 0.5,  
         lift >= 1)
```

특정 items 찾기

```
rules_tbl %>%  
  arrange(desc(lift)) %>%  
  filter(rhs == "{YouthBks}")
```

05. 연관규칙확인

```
Console Terminal Jobs
C:/Users/leecho/Desktop/R-DM/Ch10.연관규칙/
> rules_tbl %>%
+   arrange(desc(lift)) %>%
+   filter (support >= 0.1,
+           confidence >= 0.5,
+           lift >=1)
# A tibble: 20 x 8
  lhs                ...2 rhs      support confidence coverage lift count
  <chr>              <chr> <chr>    <dbl>      <dbl>      <dbl> <dbl> <int>
1 {ChildBks,CookBks} => {DoItYBks} 0.128      0.528      0.242  2.07   511
2 {ChildBks,YouthBks} => {CookBks}   0.12       0.814      0.148  1.96   480
3 {ChildBks,RefBks}   => {CookBks}   0.104      0.807      0.128  1.94   414
4 {CookBks,DoItYBks}  => {ChildBks} 0.128      0.757      0.169  1.92   511
5 {ChildBks,DoItYBks} => {CookBks}   0.128      0.791      0.162  1.90   511
6 {YouthBks,CookBks}  => {ChildBks} 0.12       0.745      0.161  1.89   480
7 {CookBks,RefBks}   => {ChildBks} 0.104      0.741      0.140  1.88   414
8 {ChildBks,GeogBks} => {CookBks}   0.110      0.749      0.146  1.80   438
9 {CookBks,GeogBks}  => {ChildBks} 0.110      0.701      0.156  1.78   438
10 {RefBks}           => {CookBks}   0.140      0.683      0.205  1.64   559
11 {YouthBks}         => {CookBks}   0.161      0.676      0.238  1.63   644
12 {DoItYBks}         => {ChildBks} 0.162      0.634      0.255  1.61   646
13 {DoItYBks}         => {CookBks}   0.169      0.662      0.255  1.59   675
14 {RefBks}           => {ChildBks} 0.128      0.626      0.205  1.59   513
15 {YouthBks}         => {ChildBks} 0.148      0.619      0.238  1.57   590
16 {CookBks}          => {ChildBks} 0.242      0.582      0.416  1.48   968
17 {ChildBks}         => {CookBks}   0.242      0.614      0.394  1.48   968
18 {GeogBks}          => {CookBks}   0.156      0.586      0.267  1.41   625
19 {GeogBks}          => {ChildBks} 0.146      0.548      0.267  1.39   585
20 {ArtBks}           => {CookBks}   0.113      0.507      0.223  1.22   452
> |
```


05. 연관규칙확인

```
Console Terminal x Jobs x
C:/Users/leecho/Desktop/R-DM/Ch10.연관규칙/
> rules_tbl %>%
+   arrange(desc(lift)) %>%
+   filter(rhs == "{YouthBks}")
# A tibble: 6 x 8
  lhs                ...2 rhs      support confidence coverage lift count
  <chr>              <chr> <chr>      <dbl>      <dbl>      <dbl> <dbl> <int>
1 {ChildBks,CookBks,GeogBks} => {YouthBks} 0.0632     0.578     0.109  2.42    253
2 {DoItYBks,GeogBks}      => {YouthBks} 0.0545     0.540     0.101  2.26    218
3 {ChildBks,CookBks,RefBks} => {YouthBks} 0.0552     0.534     0.104  2.24    221
4 {ChildBks,CookBks,DoItYBks} => {YouthBks} 0.067      0.524     0.128  2.20    268
5 {ChildBks,GeogBks}      => {YouthBks} 0.0755     0.516     0.146  2.17    302
6 {CookBks,GeogBks}       => {YouthBks} 0.0802     0.514     0.156  2.16    321
>
```

Files Plots Packages Help Viewer

06.그래프 그리기

```
# 06.그래프 그리기
```

```
# install.packages("arulesViz")
```

```
# install.packages("visNetwork")
```

```
library(visNetwork)
```

```
library(arulesViz)
```

```
plot(sort(books_rules,  
         by = "support"),  
      method = "grouped")
```

```
# {item} → {item}: 지지도(support)
```

```
# color: 향상도(Lift)
```

```
plot(sort(books_rules,  
         by = "lift")[1:20],  
      method = "graph",  
      engine = "htmlwidget")
```

06. 그래프 그리기

```
Console Terminal Jobs
C:/Users/leecho/Desktop/R-DM/Ch10.연관규칙/
package 'data.table' successfully unpacked and MD5 sums checked
package 'scatterplot3d' successfully unpacked and MD5 sums checked
package 'vcd' successfully unpacked and MD5 sums checked
package 'seriation' successfully unpacked and MD5 sums checked
package 'igraph' successfully unpacked and MD5 sums checked
package 'DT' successfully unpacked and MD5 sums checked
package 'plotly' successfully unpacked and MD5 sums checked
package 'visNetwork' successfully unpacked and MD5 sums checked
package 'arulesViz' successfully unpacked and MD5 sums checked

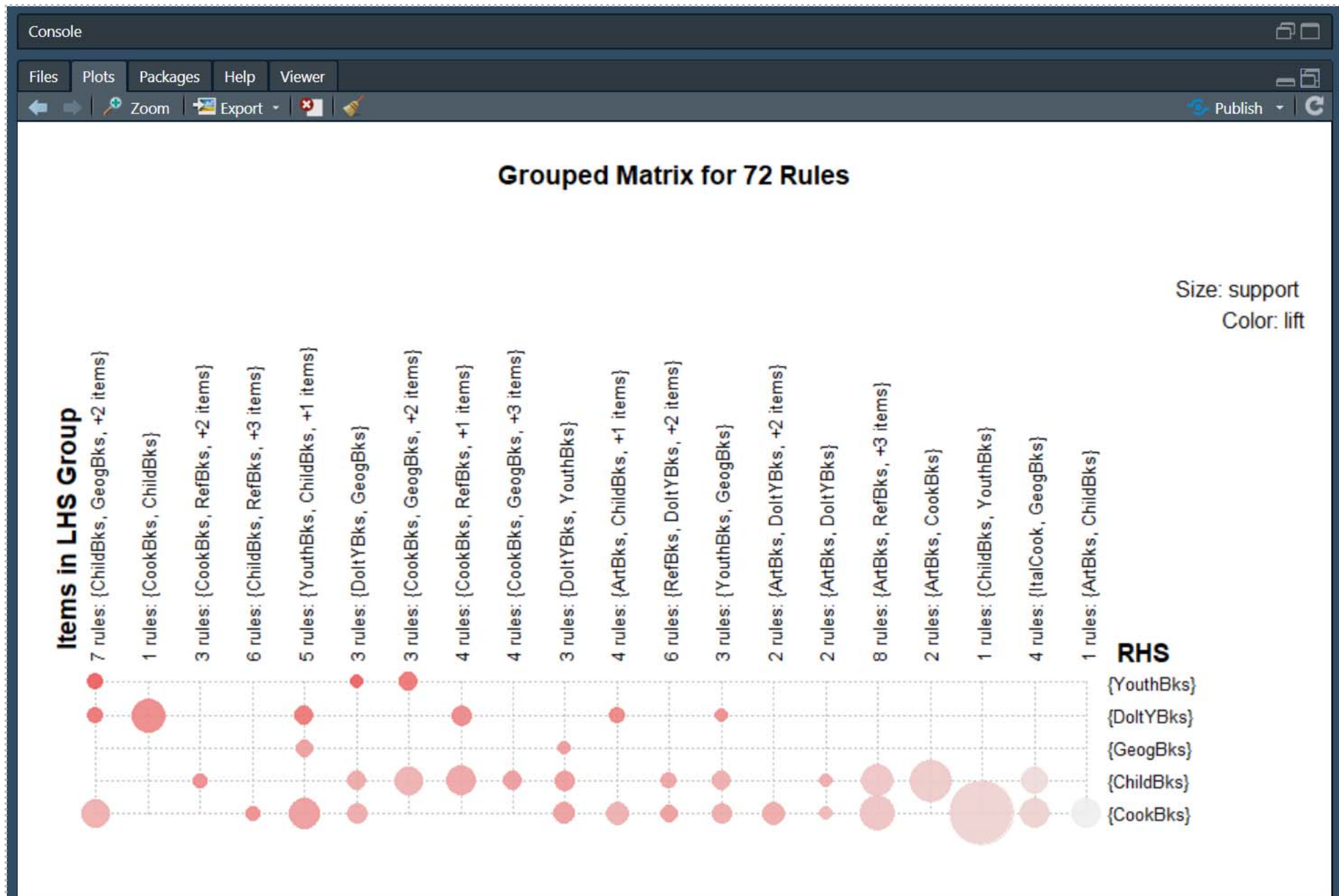
The downloaded binary packages are in
  C:\Users\leecho\AppData\Local\Temp\RtmpSaAbtI\downloaded_packages
> install.packages("visNetwork")
WARNING: Rtools is required to build R packages but is not currently installed. Please download and install the appropriate version of Rtools before proceeding:

https://cran.rstudio.com/bin/windows/Rtools/
Installing package into 'C:/Users/leecho/Documents/R/win-library/4.0'
(as 'lib' is unspecified)
URL 'https://cran.rstudio.com/bin/windows/contrib/4.0/visNetwork_2.0.9.zip'을 시도합니다
Content type 'application/zip' length 4595328 bytes (4.4 MB)
downloaded 4.4 MB

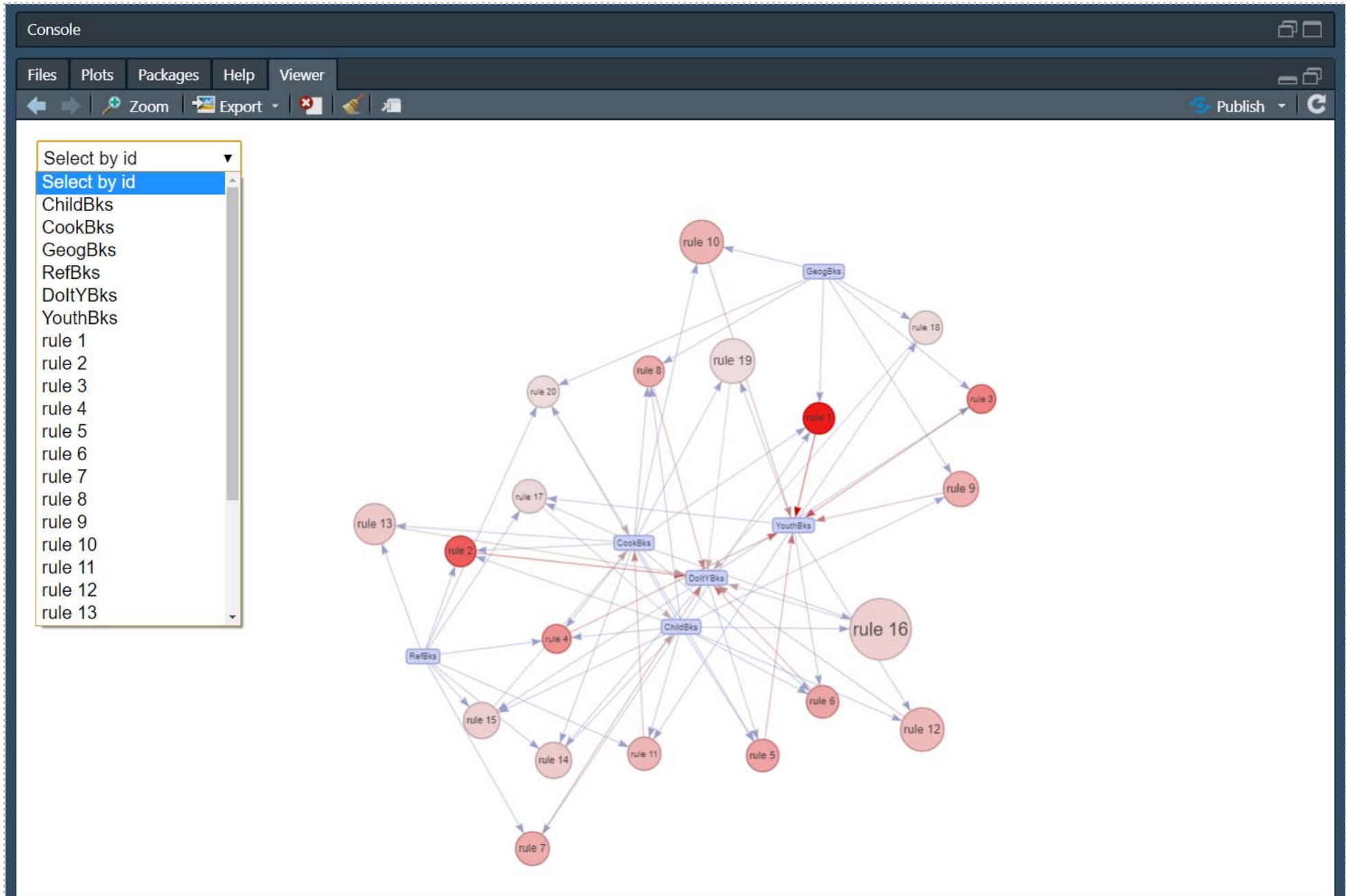
package 'visNetwork' successfully unpacked and MD5 sums checked

The downloaded binary packages are in
  C:\Users\leecho\AppData\Local\Temp\RtmpSaAbtI\downloaded_packages
> library(visNetwork)
경고메시지(들):
패키지 'visNetwork'는 R 버전 4.0.3에서 작성되었습니다
> library(arulesViz)
필요한 패키지를 로딩중입니다: grid
경고메시지(들):
패키지 'arulesViz'는 R 버전 4.0.3에서 작성되었습니다
> |
```

06. 그래프 그리기



06. 그래프 그리기



참고자료

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