# Some larger graphs

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07/11/2023

### Word of warning (for upcoming assignments)

I don't want to see exact replicates of this document. Here, you will note that I am "riffing", exploring potential ways to represent the information and discussing this. In your assignments, this is not something you would typically do. Explain what you are doing, explain what that says in terms of the graph you are considering, but get to the point, don't "riff" around unless you have a specific purpose.

# Some examples of (connected?) graphs

There are a few very interesting datasets available online. We start with something from a collection from Stanford University, see here. There are relatively large graphs, so will give us the opportunity to explore what happens when the graphs are not just a few vertices.

Let us start with something small: here. This dataset consists of 'circles' (or 'friends lists') from Facebook. Facebook data was collected from survey participants using this Facebook app. The dataset includes node features (profiles), circles, and ego networks.

When you read the description, you notice right away that the notion of connectedness is embedded in the graph description: the acronym WCC means weakly connected components, SCC being, of course, strongly connected components.

Downloading the data, we see that there are a number of files, each prefixed by a number. From the description, these files are as follows (for a given nodeId):

- nodeId.edges: The edges in the ego network for the node 'nodeId'. Edges are undirected for facebook, and directed (a follows b) for twitter and gplus. The 'ego' node does not appear, but it is assumed that they follow every node id that appears in this file.
- nodeId.circles: The set of circles for the ego node. Each line contains one circle, consisting of a series of node ids. The first entry in each line is the name of the circle.
- nodeId.feat: The features for each of the nodes that appears in the edge file.
- nodeId.egofeat : The features for the ego user.

##

• nodeId.featnames: The names of each of the feature dimensions. Features are '1' if the user has this property in their profile, and '0' otherwise. This file has been anonymized for facebook users, since the names of the features would reveal private data.

Let us take a look at nodeId=0. The most important files (for now) are O.circles and O.edges. We take a quick look at the text files themselves and remark that O.circles seems to be tsv (tab separated values) files, while the entries in O.edges are separated by spaces. Also, the data starts from the first row.

```
circles = read.csv("0.circles", sep = "\t", header = FALSE)
edges = read.csv("0.edges", sep = " ", header = FALSE)
circles
```

V1 V2 V3 V4 V5 V6 V7 V8 V9 V10 V11 V12 V13 V14 V15 V16 V17 V18

```
circle0 71 215 54 61 298 229 81 253 193
                                                   97 264
                                                            29 132 110 163 259 183
## 2
       circle1 173 NA NA NA NA NA NA NA
                                                   NA
                                                       NA
                                                           NA NA
                                                                   NA
                                                                        NA NA
                                                                                NΑ
                  99 327 140 116 147 144 150 270
## 3
       circle2 155
                                                    NA
                                                        NA
                                                            NA
                                                                NA
                                                                    NA
## 4
       circle3 51 83 237 NA NA
                                  NA NA
                                           NA NA
                                                   NA
                                                       NA
                                                           NA
                                                               NA
                                                                    NA
                                                                        NA
                                                                           NA
                                                                                NΑ
## 5
       circle4 125 344 295 257
                                55 122 223
                                           59 268 280
                                                        84 156 258 236 250 239
## 6
                           NA NA
       circle5 23 NA
                       NA
                                   NA NA NA NA
                                                   NA NA
                                                           NA
                                                               NA
                                                                   NA NA
                                                                           NΑ
       circle6 337 289
                        93
                           17 111
                                    52 137 343 192
                                                    35 326 310 214
                                                                    32 115 321 209
## 8
       circle7 225
                   46
                       NA
                           NA
                               NA
                                    NA
                                       NA
                                           NA
                                               NA
                                                    NA
                                                       NA
                                                            NA
                                                                NA
                                                                    NΑ
                                                                        NΑ
                                                                            NΑ
                                                                                ΝA
## 9
       circle8 282
                   NA
                       NA
                           NA
                               NA
                                    NA
                                       NA
                                           NA
                                               NA
                                                    NA
                                                       NA
                                                            NA
                                                                NA
                                                                    NA
                                                                        NA
                                                                            NA
                                                                                NA
## 10 circle9 336 204
                       74 206 292 146 154 164 279
                                                    73
                                                       NA
                                                            NA
                                                                NA
                                                                    NA
                                                                        NA
                                                                            NA
                                                                                NΑ
## 11 circle10 42
                   14 216
                             2 NA
                                   NA
                                       NA
                                           NA
                                               NA
                                                    NA
                                                       NA
                                                           NA
                                                                NA
                                                                    NA
                                                                        NA
                                                                           NA
                                                                                NA
## 12 circle11 324 265 54 161 298
                                    76 165 199 203
                                                    13
                                                        66 113
                                                                97 252 313 238
                                                                               158
## 13
           134 218 118 235 311 151 308 212
                                           70 211
                                                    NA
                                                       NA
                                                            NA
                                                                NA
                                                                    NA
                                                                        NΑ
                                                                           NA
                                                                                NΑ
                       NA NA
## 14 circle12 278 NA
                               NA
                                    NA
                                       NA
                                            NA
                                               NA
                                                    NA
                                                        NA
                                                            NA
                                                                NA
                                                                    NA
                                                                        NA
                                                                            NA
## 15 circle13 138 131
                        68 143
                                86
                                    NA
                                       NA
                                           NA
                                                NA
                                                    NA
                                                       NA
                                                            NA
                                                                NA
                                                                    NA
                                                                        NA
                                                                            NA
                                                                                NΑ
## 16 circle14 175 227
                       NA NA
                                NA
                                   NA
                                       NA
                                           NA
                                               NA
                                                    NA
                                                       NA
                                                            NA
                                                                NA
                                                                    NA
                                                                        NA
                                                                            NA
                                                                                NA
## 17 circle15 108 208 251 125 325 176 133 276 198 271 288 316
                                                                96 246 347 121
## 18
            56 338 23 109 141 67 345
                                       55 114 122 50 304 318
                                                                65
                                                                   15
                                                                       45 317 322
## 19
           124 285 255 129 40 172 274
                                       95 207 128 339 233
                                                             1 294 280 224 269 256
## 20
           146 77 196
                        64 286
                                89
                                   22
                                       39 190 281 117
                                                       38 213 135 197 291
## 21
           186 169 342
                       49
                             9 16 185 219 123 72 309 103 157 277 105 139 148 248
## 22
                        10 152 236 308
                                       82 87 136 200 183 247 290 303 319
           63 297 242
## 23
                       79 340 301 188 142 NA NA NA NA NA NA
           69 171 119
                                                                    NA
                                                                       NA
                                                                           NA
                                                                                NΑ
                   94 330
                                34 299 254
                                           24 180 194 281 101 266 135 197 173
## 24 circle16 251
                             5
                                                                                36
## 25
            37 258 309
                       80 139 202 187 249 58 127
                                                    48
                                                        92
                                                            NA
                                                                NΑ
                                                                    NΑ
                                                                        NΑ
                                                                            NΑ
                                                                                NΑ
## 26 circle17 90 52 172 126 294 179 145 105 210
                                                    NA
                                                       NA
                                                            NA
                                                                NA
                                                                    NA
                                                                        NA
                                                                            NΑ
                                                                                NΑ
## 27 circle18 177 NA NA NA
                               NA
                                   NA
                                       NA
                                           NA
                                               NA
                                                    NA
                                                        NA
                                                            NA
                                                                NA
                                                                    NA
                                                                        NA
                                                                            NA
                                                                                ΝA
## 28 circle19 93 33 333
                           17 137
                                    44 343 326 214 115 312
                                                            41
                                                                20
                                                                    NA
                                                                        NA
                                                                            NA
                                                                                NA
## 29 circle20 244 282 262 293 220 174
                                                                        NA
                                       NA
                                           NA
                                               NA
                                                    NA
                                                       NA
                                                            NA
                                                                NA
                                                                    NA
                                                                            NA
                                                                                ΝA
## 30 circle21 12 NA
                       NA
                                NA
                                       NA
                                           NA
                                                                        NA
                           NA
                                    NA
                                                NA
                                                    NA
                                                        NA
                                                            NA
                                                                NA
                                                                    NA
                                                                            NA
                                                                                NA
## 31 circle22 267 NA
                       NA
                           NA
                                NA
                                    NA
                                       NA
                                           NA
                                                NA
                                                    NA
                                                        NA
                                                            NA
                                                                NA
                                                                    NA
                                                                        NA
                                                                            NA
                                                                                NA
## 32 circle23 28 149 162 NA NA
                                   NA NA
                                           NA
                                               NA
                                                   NA NA
                                                           NA
                                                                NA
                                                                   NA
                                                                        NA
                                                                           NA
                                                                                NΑ
##
      V19 V20 V21
## 1
     334 245 222
## 2
      NA
          NA
## 3
      NA
          NA
              NΑ
## 4
       NA
           NA
## 5
      NA
           NA
              NΑ
## 6
      NA
           NA
              NΑ
## 7
              20
      312
           41
## 8
       NA
           NA
              NA
## 9
       NΑ
           NΑ
              NΑ
## 10
      NA
           NA
              NA
## 11
      NA
          NA
              NA
## 12 240 331 332
## 13
      NA
           NA
              NΑ
## 14
      NA
           NA
              NA
## 15
      NA
           NA
              ΝA
## 16
      NA NA
              NA
## 17
       3 170 323
## 18
      26
          31 168
## 19 60 328 189
## 20 261 47
               36
## 21 341 62
              98
```

```
## 22 104 127
## 23
      NA NA
               NA
## 24
        9
           85
               57
## 25
      NA
           NA
               NA
## 26
       NA
           NA
               NA
## 27
      NA
           NA
               NA
## 28
      NA
           NA
               NA
## 29
      NA
           NA
               NA
## 30
      NA
           NA
               NA
## 31
      NA
           NA
               NA
## 32
      NA
           NA
               NA
```

#### head(edges)

```
## V1 V2
## 1 236 186
## 2 122 285
## 3 24 346
## 4 271 304
## 5 176 9
## 6 130 329
```

edges went fine, but for circles, we have a problem: despite the fact that all entries in circle15, for instance, seem to be on the same line in the file, they are read as multiple lines. Let us confirm.

```
dim(circles)
```

### ## [1] 32 21

Yup, clearly a problem here, there should be way more than 21 columns! Let us try something a bit more evolved: we read line by line and process this. We make a little function (slightly adapted from one here).

```
processFile = function(filepath) {
    con = file(filepath, "r")
    OUT = list()
    i = 1
    while ( TRUE ) {
        line = readLines(con, n = 1)
        if ( length(line) == 0 ) {
            break
        }
        OUT[[i]] = line
        i = i+1
    }
    close(con)
    return(OUT)
}
circles = processFile("0.circles")
```

Note that you can also suppress code output:

## [1] "circle0\t71\t215\t54\t61\t298\t229\t81\t253\t193\t97\t264\t29\t132\t110\t163\t259\t183\t334\t24 Looks good. Let us process this to make things a bit easier to use.

```
for (i in 1:length(circles)) {
    circles[[i]] = gsub("\t", ",", circles[[i]])
circles[[1]]
## [1] "circle0,71,215,54,61,298,229,81,253,193,97,264,29,132,110,163,259,183,334,245,222"
This one's okay, now let us make the graph, using graph_from_edgelist (from_edgelist for short); see
help here. Data description says the facebook graph is undirected, so we use that option.
library(igraph)
##
## Attaching package: 'igraph'
## The following objects are masked from 'package:stats':
       decompose, spectrum
##
## The following object is masked from 'package:base':
##
##
       union
G = graph_from_edgelist(as.matrix(edges), directed = FALSE)
plot(G)
gorder(G)
## [1] 347
C = components(G)
writeLines(paste0("Number of components: ", C$no))
## Number of components: 19
C$csize
## [1] 324
```

Let us keep only the vertices in the largest connected component (the one with  $-\infty$  vertices). We look at the membership information.

```
groups(C)
```

```
## $`1`
                               6
                                  7
                                                                               22
##
     [1]
               2
                   3
                       4
                           5
                                       8
                                           9 10
                                                   13 14
                                                           16 17
                                                                   19
                                                                       20
                                                                           21
           1
    [19]
         23
              24
                  25
                      26
                          27
                              28
                                  29
                                      30
                                          31
                                               32
                                                   34
                                                       35
                                                           36
                                                               38
                                                                   39
    [37]
         45
                  47
                      48
                                      52
                                          53
                                               54
                                                           57
              46
                          49
                              50
                                  51
                                                   55
                                                       56
                                                               58
                                                                   59
                                                                       60
                                                                           61
                                                                               62
    [55]
         63
              64
                  65
                      66
                          67
                              68
                                  69
                                      70
                                          71
                                               72
                                                   73
                                                       75
                                                           76
                                                               77
                                                                   78
                                                                       79
                                                                           80
   [73] 82
                                      89
                                              92 93
                                                       94
##
             83
                  84
                     85
                          86
                              87
                                  88
                                          91
                                                          95
                                                              96
                                                                  97
                                                                       98
                                                                           99 100
   [91] 101 102 103 104 105 106 107 108 109 110 111 112 113 115 116 117 118 119
## [109] 120 121 122 123 124 125 126 127 128 129 130 131 132 133 134 135 136 137
## [127] 138 139 140 141 142 143 144 146 147 148 149 150 151 152 153 154 155 156
## [145] 157 158 159 160 161 162 163 164 165 166 167 168 169 170 171 172 173 174
## [163] 175 176 177 178 180 181 182 183 184 185 186 187 188 189 190 191 192 193
## [181] 194 195 196 197 198 199 200 201 202 203 204 205 206 207 208 211 212 213
## [199] 214 216 217 218 219 220 221 222 223 224 225 226 227 228 229 230 231 232
## [217] 234 235 236 237 238 239 240 241 242 243 245 246 247 248 249 250 251 252
## [235] 253 254 255 257 258 259 260 261 262 263 264 265 266 267 268 269 270 271
## [253] 272 273 274 275 276 277 278 279 280 281 283 284 285 286 288 289 290 291
## [271] 293 294 295 296 297 298 299 300 301 302 303 304 305 306 307 308 309 310
## [289] 311 312 313 314 315 316 317 318 319 320 321 322 323 324 325 326 327 328
## [307] 329 330 331 332 333 334 336 337 338 339 340 341 342 343 344 345 346 347
## $^2`
## [1] 11
##
## $\3\
## [1] 12
## $`4`
## [1] 15
##
## $`5`
## [1] 18
##
## $`6`
## [1] 33 42
##
## $`7`
## [1] 37
##
## $`8`
## [1] 43
##
## $`9`
## [1] 74
##
## $`10`
## [1] 90 145 179
##
## $`11`
## [1] 114
##
## $`12`
## [1] 209
##
## $`13`
```

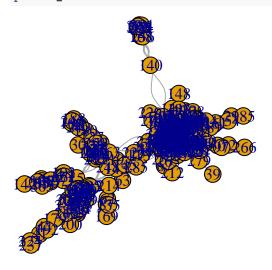
```
## [1] 210
##
## $\14\
## [1] 215
##
## $`15`
## [1] 233 256
##
## $`16`
## [1] 244 282
## $`17`
## [1] 287
##
## $`18`
## [1] 292
##
## $`19`
## [1] 335
```

We need to be able to find what component is the largest. To do that, we simply seek the group with the most elements.

```
idx_large = which(unlist(lapply(groups(C), length) == max(C$csize)))
idx_large

## 1
## 1

G_c = induced_subgraph(G, groups(C)[[idx_large]])
plot(G_c)
```



## Another example

To see how efficacious component computation goes, let us look at this dataset. We just load one file of the three in the zip file. The file is quite big, so we do not unzip it and just load it as is. The next operation might take a while.

```
twitch <- read.csv(unz("large_twitch_edges.csv.zip", "large_twitch_edges.csv"))</pre>
```

#### head(twitch)

```
##
     numeric_id_1 numeric_id_2
## 1
             98343
                          141493
## 2
             98343
                           58736
## 3
             98343
                          140703
## 4
             98343
                          151401
## 5
             98343
                          157118
## 6
             98343
                          125430
```

#### dim(twitch)

```
## [1] 6797557 2
```

Ah, that's bigger! We'll load but not try to plot..

```
\#G = graph\_from\_edgelist(as.matrix(twitch), directed = FALSE)
```

Actually, strike that: tried this, it's too big for the machines at syzygy.ca, it seems. So I ran this on one of the beefy machines of my home cluster and saved the result as an Rds file, which I will distribute. Actually, doing this I realised that perhaps the problem was that the data contains reference to vertices labelled 0, and taking them out was important. Let's see if that works here.

Let us try another way to clean up data, using the so-called tidyverse. Note that when loading libraries and the like, you can also suppress the output. Sometimes it is not easy, but usually, trying the following should do the trick.

```
suppressPackageStartupMessages(library(tidyverse))
#library(tidyverse)

G = graph_from_edgelist(as.matrix(twitch), directed = FALSE)
```

Works, now! There are  $1.68114 \times 10^5$  vertices in the graph. The graph is connected? TRUE. You could also do like so: The graph is **connected**.