Blogosphere
Communities
Bonus

Homeplay for week 02's lab: code Blogosphere

Let's look at the blogosphere data we have now seen a few times. You haven't actually touched the data, so we are going to do that now.

- 1. Load the blogosphere network from the SNA4DSData package.
- 2. Clean it up a bit: there are some blogs that refer to themselves ("loops"). That is not what we want, so remove these loops. How do I do that, you ask? Well, search through the documentation for <code>igraph</code>. Alternatively, see if you can find the solution in the course cheatsheet. From here on, continue with this cleaned graph.

```
## This graph was created by an old(er) igraph version.
## i Call `igraph::upgrade_graph()` on it to use with the current igraph version.
## For now we convert it on the fly...
```

- 1. Calculate summary statistics for this network. At least determine:
- · mean distance
- diameter
- dyad census
- reciprocity
- transitivity
- density

Interpret these numbers, do you understand what they mean? Are they what you would expect?

```
# mean distance
snafun::g_mean_distance(blog1)
```

```
## Registered S3 methods overwritten by 'snafun':
## method from
## plot.igraph igraph
## print.igraph igraph
```

```
## [1] 3.390184
```

```
# diameter
snafun::g_diameter(blog1)
## [1] 9
# dyad census
snafun::count_dyads(blog1)
   Mutual Asymmetric
                         Null
##
##
      2307
                14408 1092590
# reciprocity
snafun::g_reciprocity(blog1)
## [1] 0.2425612
# transitivity
snafun::g_transitivity(blog1)
## [1] 0.2395381
# density
snafun::g_density(blog1)
## [1] 0.008573837
```

Communities

I already told you that the network is quite polarized: republican blogs see to refer mainly to other republican blogs, and the same holds for democratic blogs. So, you would expect some clear subgroups in this network.

1. Use the walktrap algorithm to determine communities in the blogosphere network. How many communities do you get? Does the partitioning make sense? What do you notice about the result? (hint: use the cheatsheet to see how you can combine snafun and igraph here)

```
walk <- snafun::extract_comm_walktrap(blog1)
igraph::membership(walk) |> table()
```

```
##
##
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                   4
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                                 7
                                     8
                                          9
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                                                                                           20
                        2
## 560
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            640
                   2
                            4
                                 2
                                     2
                                          2
                                              2
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         62
                      65
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##
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## 261 262 263 264 265 266 267 268 269 270 271 272 273 274 275 276 277 278
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```

igraph::sizes(walk)

```
## Community sizes
##
      1
          2
               3
                        5
                             6
                                  7
                                       8
                                           9
                                               10
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##
   560
          4
            640
                    2
                        2
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                                       2
                                           2
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                       25
                                          29
         22
              23
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##
    21
                  24
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##
    61
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##
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##
      1
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## 121 122 123 124 125 126
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## 181 182 183 184 185 186
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## 201 202 203 204 205 206 207 208 209 210 211 212 213 214 215 216 217 218 219 220
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## 261 262 263 264 265 266 267 268 269 270 271 272 273 274 275 276 277 278
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```

```
igraph::sizes(walk) |> length()
```

```
## [1] 278
```

```
igraph::modularity(walk)
```

```
## [1] 0.4302334
```

- 1. One thing that might affect the result is that a bunch of the blogs do not point to another blog and no other blog points to them. In SNA we call these nodes *isolates*.
- 2. What do you think would happen to the results if you would remove those isolates first? First, think about this. Then actually remove the isolates from the graph and run the walktrap again. Check if you were correct.

```
blog0 <- snafun::remove_isolates(blog1)
walk0 <- snafun::extract_comm_walktrap(blog0)
igraph::membership(walk0) |> table()
```

```
##
##
    1
        2
            3
                           7
                              8
                                  9 10 11 12
                          2
## 560
        4 640
                2
                   2
                              2
                                  2
                                     2
                                          2
                                             2
igraph::modularity(walk0)
## [1] 0.4302334
igraph::sizes(walk0) |> length()
## [1] 12
```

Bonus

Continue with this smaller network. You should have 1224 vertices left and 19022 edges between them.

- 1. Add the group membership (which you get with <code>igraph::membership</code>) to the network as a vertex attribute. Call this new vertex attribute <code>community</code>.
- 2. Run the following function: snafun::make_mixingmatrix(graph_without_isolates, "community") and check the help documentation of snafun::make_mixingmatrix to interpret the result. Does it make sense? What does this tell you about the boundaries around the communities? (obviously, replace graph_without_isolates with the actual object name you are using).
- 3. Extract all of the vertex attributes using snafun::extract_all_vertex_attributes and explore whether it is indeed the case that like-minded blogs tend cluster together inside the communities you found. (hint: the simplest approach is to use a table)

```
blog0 <- snafun::add_vertex_attributes(blog0, "community", value = igraph::membership(walk
0))
# alternatively
# igraph::V(blog0)$community <- igraph::membership(walk0)

# mixing matrix
snafun::make_mixingmatrix(blog0, "community")</pre>
```

```
##
        to
## from
             1
                    2
                          3
                                4
                                       5
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                                                          8
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                                                                      10
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                        633
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     7
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##
        to
## from
           Sum
          8977
##
     1
     2
             8
##
##
     3
         10016
     4
             3
##
     5
             2
##
             5
##
     6
##
     7
             2
     8
             1
##
     9
             1
##
             4
##
     10
##
     11
             2
     12
             1
##
     Sum 19022
```

```
# alternative, outside of the graph object
all_attr <- snafun::extract_all_vertex_attributes(blog0)
table(all_attr$community, all_attr$party)</pre>
```

```
##
##
        conservative liberal
##
     1
                   23
                           537
##
     2
                    1
                             3
##
     3
                  604
                            36
                    2
                             0
##
     4
     5
##
                    0
                             2
     6
                    4
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##
     7
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                    0
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##
     8
                    2
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##
     9
##
     10
                    0
                             2
                             2
##
     11
                    0
                             2
##
     12
                    0
```

Overall, you shouldn't be surprised about the strong political divide in the USA at the moment. This was already apparent in the 2004 elections... You just showed that yourself!

