## The Southern Ocean Food Web

```
Load required libraries:
```

```
require(igraph)
require(NetIndices)
require(reshape2)
require(ggplot2)
require(devtools)
require(vegan)
```

Source code for functions to describe web properties

```
url <- "https://raw.github.com/jjborrelli/Ecological-Networks/master/Food%20Webs/Rscripts/we
source_url(url)</pre>
```

Load in the data

```
# s.ocean <- read.csv('http://esapubs.org/archive/ecol/E092/097/diet.csv')
s.ocean <- read.csv("~/Downloads/diet.csv")</pre>
```

## Whole Southern Ocean

```
el.df <- data.frame(pred = s.ocean$PREDATOR_NAME, prey = s.ocean$PREY_NAME)
SOgraph <- graph.edgelist(unique(as.matrix(el.df[, 1:2])))
SOadjacency <- get.adjacency(SOgraph, sparse = F)</pre>
```

First take a quick look at what the food web looks like. Here I plot the web by trophic level by setting the layout (code shown below). Nodes are plotted with trophic position along the y-axis and plotted along the x-axis according to a random uniform distribution (runif(x, 0, 1)).

```
par(mar = c(0, 0, 0, 0))
layouts <- matrix(c(runif(gind$N), tind$TL), ncol = 2)
plot.igraph(SOgraph, layout = layouts, vertex.label = NA, edge.arrow.size = 0.5,
    vertex.size = 1)</pre>
```

The plot of the web is not very helpful because there are so many species and far too many interactions. So looking at some of the whole web statistical properties and node properties may be more useful than just plotting the web.

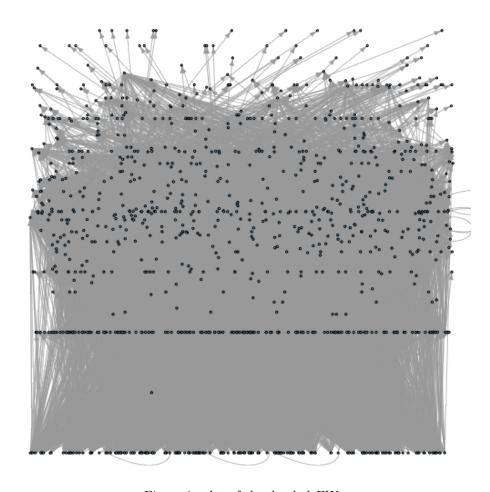


Figure 1: plot of chunk whole FW  $\,$ 

The NetIndices and igraph packages have functions to calculate a number of commonly used food web indices. The function GenInd from the NetIndices library easily calculates the number of nodes (N), total number of links (L), link density  $(\frac{L}{N} = LD)$ , and connectance (along with some other indices that are not relevant to this dataset). Connectance in this case is calculated as:

$$C = \frac{L}{N * (N-1)}$$

The diameter is the single longest path between two nodes. The average.path.length is the mean number of links between any two nodes in the web. The clustering coefficient (or transitivity) is the probability that the nearest neighbors of a given vertex are themselves connected. A high clustering coefficient is an indication that a network has "small world" properties. The sum of the diagonal elements of the adjacency matrix gives the number of species that are cannibalistic, with links that loop back to themselves.

Species in a food web may be either basal, intermediate, or top. These positions may be determined simply by examining the degree of each node. The number of links pointing towards a node is its in-degree and the number of links pointing away from a node is the out-degree. In-degree is therefore a measure of how many species the node of interest preys upon (generality) while out-degree is the number of predators a given node has (vulnerability). Basal nodes will have an in-degree of 0, and likewise top species will have an out-degree of 0. Once the number of basal and top species are found, the number of intermediate species is simply the remainder.

```
gind <- GenInd(SOadjacency)</pre>
diam <- diameter(SOgraph)</pre>
avpath <- average.path.length(SOgraph)</pre>
cluster <- transitivity(SOgraph)</pre>
cannibals <- sum(diag(SOadjacency))</pre>
degrees <- degree(SOgraph, mode = "all")</pre>
indegrees <- degree(SOgraph, mode = "in")</pre>
outdegrees <- degree(SOgraph, mode = "out")</pre>
numBas <- length(indegrees[which(indegrees == 0)])</pre>
numTop <- length(outdegrees[which(outdegrees == 0)])</pre>
basal <- (numBas/gind$N) * 100</pre>
top <- (numTop/gind$N) * 100</pre>
int <- ((gind\$N - (numBas + numTop))/gind\$N) * 100
web.props <- data.frame(N = gind$N, L = gind$Ltot, LD = gind$LD, C = gind$C,
    D = diam, AvgPath = avpath, ClCoef = cluster, Can = cannibals, Bas = basal,
    Top = top, Int = int)
```

```
N L LD C D AvgPath ClCoef Can Bas Top Int 1 1095 10395 9.493 0.008677 6 \, 2.114 0.1941 30 15.8 69.68 14.52
```

There are a total of 1095 species with 10395 interactions among them. The longest chain described in this food web is 6 but the average chain is 2.1144.

The short average path length in the food web is made clearer by looking at the distribution of trophic positions in the Southern Ocean Food Web.

```
qplot(tind$TL, binwidth = 0.25, geom = "histogram", xlab = "Trophic Position",
    ylab = "Frequency")
```

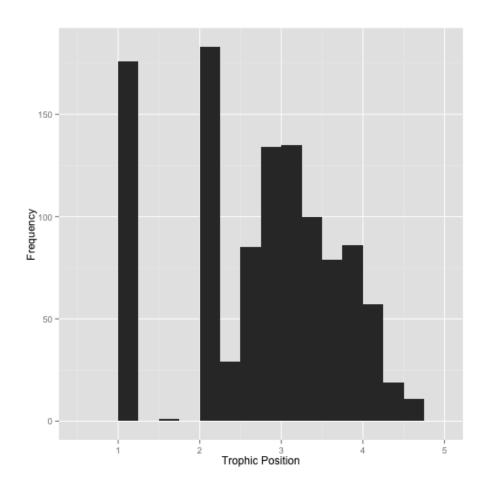


Figure 2: plot of chunk TLplot

There is a tall bar at trophic level 1 and 2 representing plants and herbivores. There is a single organism, *Chionodraco hamatus*, with a trophic level between 1

and 2, suggesting that it consumes both plant and animals (a true omnivore). I am unconvinced, however, that the dataset includes a fully sampled food web and that some of those organisms described as basal are not plants, but are crustaceans, or other small organisms.

Most of the species in the food web are "top" predators with 70% of sampled species having no predators themselves. Plants ("basal species") make up 16% of the web, and the remaining 15% are "intermediate". The disproportionately large proportion of "top" species is unusual compared to other empirically described food webs and may be the result of sampling methods. The connectance of the Southern Ocean Food Web is relatively low at 0.0087, but that is expected with such a large number of species.

The degree distribution of a food web is often described as being power-law distributed, with most nodes having few links, and few nodes having many links. The degree distribution may be plotted as a histogram. Rather than fitting a power law to the distribution I have fit a lognormal distribution to the data, as it appears to be the better fit. In the following plot I have included a line fit to a lognormal (blue) and power law (green) distributions. The lognormal distribution appears to be a better fit to the degree distribution.

## By location

The following code splits up the dataframe by the location column. The resulting 228 graph objects get stored in location.g. NOTE: the first location is a blank (" ") indicating that there are some rows without a location

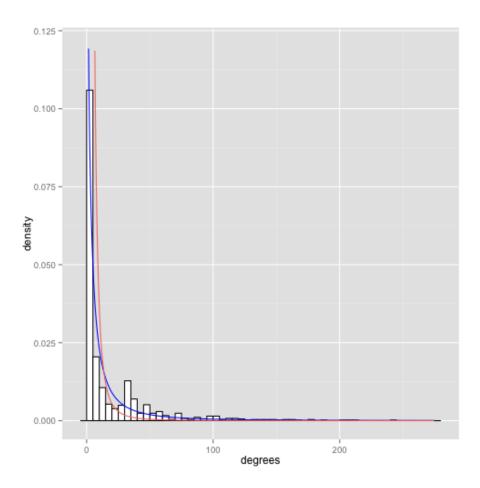


Figure 3: plot of chunk degreeDIST

```
m <- split(s.ocean, f = s.ocean$LOCATION)
location.g <- list()
for (i in 1:length(levels(s.ocean$LOCATION))) {
    el.df <- data.frame(pred = m[[i]]$PREDATOR_NAME, prey = m[[i]]$PREY_NAME)
    g <- graph.edgelist(unique(as.matrix(el.df[, 1:2])))
    location.g[[i]] <- g
}</pre>
```

Plotting webs by location provides some idea about what trophic information was obtained from different sampling locations in the Southern Ocean; the labels 1:228 correspond to levels(s.ocean\$LOCATION):

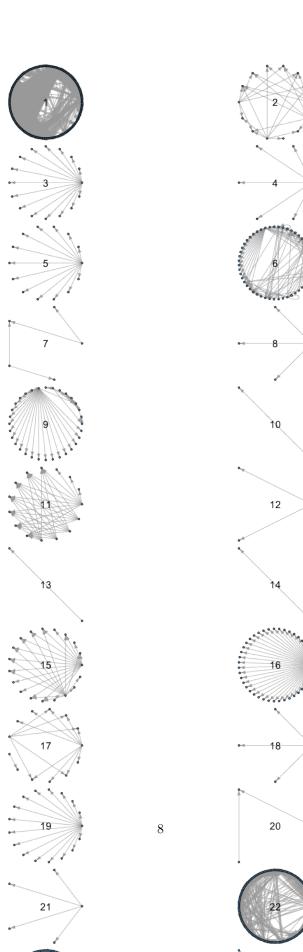
```
par(mfrow = c(114, 2), mar = c(0.01, 0.01, 0.01, 0.01))
for (i in 1:228) {
    plot.igraph(location.g[[i]], layout = layout.circle, edge.arrow.size = 0.5,
        vertex.label = NA, vertex.size = 5)
    text(0, 0, label = i, cex = 2)
}
```

It is readily apparent from the food web plots that some sampling locations (e.g., Bay of Morbihan, Kerguelen Islands; Iles Crozets; Seal Island; etc.) included only a single predator with a portion of its prey. Others, like Amanda Bay and Rampen, included a single prey with some of its predators. A few locations, however, have enough species and interactions to be conisdered a near complete food web themselves (e.g., Croker Passage; Scotia Sea, Weddell Sea). Most webs have a small number of predators and prey and a few interactions.

Like the whole food web properties calculated above, indices can be calculated for each of the location subwebs.

```
web.props1 <- data.frame()
for (i in 1:228) {
    gind <- GenInd(get.adjacency(location.g[[i]], sparse = F))
    diam <- diameter(location.g[[i]])
    avpath <- average.path.length(location.g[[i]])
    cluster <- transitivity(location.g[[i]])
    cannibals <- sum(diag(get.adjacency(location.g[[i]], sparse = F)))

degrees <- degree(location.g[[i]], mode = "all")
    indegrees <- degree(location.g[[i]], mode = "in")
    outdegrees <- degree(location.g[[i]], mode = "out")</pre>
```



```
numBas <- length(indegrees[which(indegrees == 0)])</pre>
    numTop <- length(outdegrees[which(outdegrees == 0)])</pre>
    basal <- (numBas/gind$N) * 100</pre>
    top <- (numTop/gind$N) * 100</pre>
    int <- ((gind$N - (numBas + numTop))/gind$N) * 100
    web.props <- data.frame(N = gind$N, L = gind$Ltot, LD = gind$LD, C = gind$C,
        D = diam, AvgPath = avpath, ClCoef = cluster, Can = cannibals, Bas = basal,
        Top = top, Int = int)
    web.props1 <- rbind(web.props1, web.props)</pre>
}
print(web.props1)
      N
                   LD
                            C D AvgPath
                                           ClCoef Can
                                                          Bas
                                                                  Top
1
    232 2158
              9.3017 0.04027 4
                                   1.261 0.020466
                                                     1 25.431 65.086 9.483
2
              1.9286 0.14835 1
                                   1.000 0.000000
                                                     0 28.571 71.429 0.000
3
              0.9375 0.06250 1
                                                        6.250 93.750 0.000
     16
          15
                                   1.000 0.000000
4
      6
              0.8333 0.16667 1
                                   1.000 0.000000
                                                     0 16.667 83.333 0.000
5
     14
              0.9286 0.07143 1
                                   1.000 0.000000
                                                        7.143 92.857 0.000
6
              1.9216 0.03843 3
                                   1.203 0.060484
                                                     2 29.412 62.745 7.843
7
      5
              0.8000 0.20000 1
                                   1.000 0.000000
                                                     0 40.000 60.000 0.000
8
                                                     0 25.000 75.000 0.000
      4
           3
              0.7500 0.25000 1
                                   1.000 0.000000
9
     32
          33
              1.0312 0.03327 2
                                   1.057 0.000000
                                                     0 9.375 87.500 3.125
10
              0.5000 0.50000 1
                                   1.000
                                              NaN
                                                     0 50.000 50.000 0.000
              2.5333 0.18095 1
                                   1.000 0.000000
                                                     0 33.333 66.667 0.000
11
     15
          38
12
      3
              0.6667 0.33333 1
                                   1.000 0.000000
                                                     0 33.333 66.667 0.000
      2
              0.5000 0.50000 1
                                   1.000
                                                     0 50.000 50.000 0.000
13
                                              NaN
14
      2
              0.5000 0.50000 1
                                   1.000
                                                     0 50.000 50.000 0.000
           1
                                              NaN
15
     19
          27
              1.4211 0.07895 1
                                   1.000 0.000000
                                                     0 10.526 89.474 0.000
16
     43
              0.9767 0.02326 1
                                   1.000 0.000000
                                                        2.326 97.674 0.000
          42
17
     13
              1.1538 0.09615 1
                                   1.000 0.000000
                                                     0 23.077 76.923 0.000
18
      4
              0.7500 0.25000 1
                                   1.000 0.000000
                                                     0 25.000 75.000 0.000
19
     17
          16
              0.9412 0.05882 1
                                   1.000 0.000000
                                                        5.882 94.118 0.000
20
      3
              0.6667 0.33333 1
                                                     0 66.667 33.333 0.000
                                   1.000 0.000000
21
      5
              0.8000 0.20000 1
                                   1.000 0.000000
                                                     0 20.000 80.000 0.000
22
    167
         337
              2.0180 0.01216 2
                                   1.259 0.003253
                                                       4.192 92.216 3.593
23
    141
         274
              1.9433 0.01388 1
                                   1.000 0.000000
                                                        8.511 91.489 0.000
24
      2
           1
              0.5000 0.50000 1
                                   1.000
                                              NaN
                                                     0 50.000 50.000 0.000
                                                        2.564 97.436 0.000
25
     39
              0.9744 0.02564
                                   1.000 0.000000
26
     17
              1.2941 0.08088
                                   1.000 0.000000
                                                     0 23.529 76.471 0.000
27
              0.8333 0.16667 1
                                   1.000 0.000000
                                                     0 16.667 83.333 0.000
      6
28
     24
             0.9583 0.04167 1
                                   1.000 0.000000
                                                        4.167 95.833 0.000
                                                     0 26.087 73.913 0.000
29
     23
              1.8696 0.08498 1
                                   1.000 0.000000
30
      5
           4 0.8000 0.20000 1
                                   1.000 0.000000
                                                     0 20.000 80.000 0.000
```

```
31
     61
              0.9836 0.01639 1
                                   1.000 0.000000
                                                       1.639 98.361 0.000
                                   1.000 0.000000
32
     49
              0.9796 0.02041 1
                                                        2.041 97.959 0.000
          48
33
      3
               0.6667 0.33333 1
                                   1.000 0.000000
                                                     0 33.333 66.667 0.000
              0.5000 0.50000 1
34
      2
                                   1.000
                                               NaN
                                                     0 50.000 50.000 0.000
           1
35
      3
               0.6667 0.33333
                                   1.000 0.000000
                                                     0 33.333 66.667 0.000
      2
              0.5000 0.50000 1
                                                     0 50.000 50.000 0.000
36
                                   1.000
                                               NaN
           1
                                   1.000 0.000000
                                                        4.348 95.652 0.000
37
     23
               0.9565 0.04348 1
     30
               0.9667 0.03333 1
                                   1.000 0.000000
                                                        3.333 96.667 0.000
38
          29
                                                     0
39
                                                        6.250 93.750 0.000
     16
               0.9375 0.06250 1
                                   1.000 0.000000
40
     18
              0.9444 0.05556 1
                                   1.000 0.000000
                                                        5.556 94.444 0.000
          17
41
      4
               0.7500 0.25000 1
                                   1.000 0.000000
                                                     0 25.000 75.000 0.000
           2
                                                     0 33.333 66.667 0.000
42
      3
              0.6667 0.33333 1
                                   1.000 0.000000
43
      2
           1
              0.5000 0.50000 1
                                   1.000
                                              NaN
                                                     0 50.000 50.000 0.000
                                   1.000 0.000000
44
     27
              1.3333 0.05128 1
                                                     0 11.111 88.889 0.000
45
     26
          25
              0.9615 0.03846 1
                                   1.000 0.000000
                                                        3.846 96.154 0.000
46
     10
           9
               0.9000 0.10000 1
                                   1.000 0.000000
                                                     0 10.000 90.000 0.000
47
      9
          14
              1.5556 0.19444 1
                                   1.000 0.000000
                                                     0 22.222 77.778 0.000
48
     24
               0.9583 0.04167 1
                                   1.000 0.000000
                                                        8.333 91.667 0.000
               1.4681 0.03191 1
                                                        6.383 93.617 0.000
49
     47
          69
                                   1.000 0.000000
50
     25
               0.9600 0.04000
                                   1.000 0.000000
                                                        4.000 96.000 0.000
51
      2
              0.5000 0.50000 1
                                   1.000
                                               NaN
                                                     0 50.000 50.000 0.000
           1
      4
               0.7500 0.25000 1
                                   1.000 0.000000
                                                     0 25.000 75.000 0.000
52
    113 2852 25.2389 0.22535 2
                                                    10 69.912 21.239 8.850
53
                                   1.058 0.356413
              1.5625 0.05040 1
                                                     1 12.500 84.375 3.125
54
     32
                                   1.000 0.000000
     10
55
          13
              1.3000 0.14444 1
                                   1.000 0.000000
                                                     0 30.000 70.000 0.000
56
     31
              0.9677 0.03226 1
                                   1.000 0.000000
                                                        3.226 96.774 0.000
      3
              0.6667 0.33333 1
                                   1.000 0.000000
                                                     0 33.333 66.667 0.000
57
58
    113
         225
               1.9912 0.01778 2
                                   1.277 0.006606
                                                     0
                                                        7.965 90.265 1.770
              0.9737 0.02632 1
                                   1.000 0.000000
                                                        2.632 97.368 0.000
59
     38
          37
                                                     0
     27
              1.9259 0.07407 2
                                   1.136 0.025140
                                                        7.407 85.185 7.407
60
          52
                                                     1
61
     33
          32
              0.9697 0.03030 1
                                   1.000 0.000000
                                                     0
                                                        3.030 96.970 0.000
              0.9000 0.10000 1
                                   1.000 0.000000
                                                     0 10.000 90.000 0.000
62
     10
           9
63
     40
              0.9750 0.02500 1
                                   1.000 0.000000
                                                        2.500 97.500 0.000
                                   1.000 0.000000
64
     17
              0.9412 0.05882 1
                                                        5.882 94.118 0.000
65
     16
               0.9375 0.06250
                                   1.000 0.000000
                                                        6.250 93.750 0.000
              0.9000 0.10000 1
                                                     0 10.000 90.000 0.000
66
     10
           9
                                   1.000 0.000000
67
     28
               1.6071 0.05952 1
                                   1.000 0.000000
                                                     0 25.000 75.000 0.000
                                                        2.439 97.561 0.000
68
     41
              0.9756 0.02439 1
                                   1.000 0.000000
          40
69
     27
               1.5926 0.06125
                                   1.000 0.000000
                                                     0 29.630 70.370 0.000
          43
70
     24
          33
              1.3750 0.05978 2
                                   1.158 0.101887
                                                        0.000 91.667 8.333
               0.8000 0.20000 1
                                                     0 20.000 80.000 0.000
71
      5
                                   1.000 0.000000
72
      5
              0.8000 0.20000 1
                                   1.000 0.000000
                                                     0 20.000 80.000 0.000
73
               0.9545 0.04545 1
                                                        4.545 95.455 0.000
     22
          21
                                   1.000 0.000000
74
              0.7500 0.25000 1
                                   1.000 0.000000
                                                     0 25.000 75.000 0.000
      4
           3
75
      3
           2
              0.6667 0.33333 1
                                   1.000 0.000000
                                                     0 33.333 66.667 0.000
76
              0.6667 0.33333 1
                                   1.000 0.000000
                                                     0 33.333 66.667 0.000
      3
```

```
7
77
          10
              1.4286 0.23810 1
                                   1.000 0.000000
                                                     0 28.571 71.429 0.000
78
      2
              0.5000 0.50000 1
                                                     0 50.000 50.000 0.000
           1
                                   1.000
                                               NaN
79
     22
               1.0455 0.04978 1
                                   1.000 0.000000
                                                        9.091 90.909 0.000
              1.0667 0.07619
                                   1.158 0.083333
                                                        6.667 86.667 6.667
80
     15
          16
81
     84
         151
               1.7976 0.02166
                                   1.000 0.000000
                                                        8.333 91.667 0.000
82
     25
              0.9600 0.04000 1
                                   1.000 0.000000
                                                     0
                                                        4.000 96.000 0.000
          24
83
     12
          12
               1.0000 0.09091 1
                                   1.000 0.000000
                                                     0 16.667 83.333 0.000
               0.6000 0.15000 1
                                   1.000 0.000000
                                                     0 60.000 40.000 0.000
84
      5
           3
      7
85
          11
               1.5714 0.26190 1
                                   1.000 0.000000
                                                     0 42.857 57.143 0.000
86
              0.9697 0.03030 1
                                   1.000 0.000000
                                                        3.030 96.970 0.000
     33
              0.9375 0.06250 1
87
     16
          15
                                   1.000 0.000000
                                                        6.250 93.750 0.000
88
      4
              0.7500 0.25000
                                   1.000 0.000000
                                                     0 25.000 75.000 0.000
89
      8
           7
               0.8750 0.12500 1
                                   1.000 0.000000
                                                     0 12.500 87.500 0.000
90
      6
               1.0000 0.20000 1
                                   1.000 0.000000
                                                     0 33.333 66.667 0.000
91
     72
          77
               1.0694 0.01506 1
                                   1.000 0.000000
                                                     0
                                                       5.556 94.444 0.000
92
      8
           7
               0.8750 0.12500 1
                                   1.000 0.000000
                                                     0 12.500 87.500 0.000
93
     22
          21
              0.9545 0.04545 1
                                   1.000 0.000000
                                                        9.091 90.909 0.000
94
     12
              2.3333 0.21212 1
                                   1.000 0.000000
                                                     0 58.333 41.667 0.000
95
              0.9231 0.07692 1
                                                     0 92.308 7.692 0.000
     13
          12
                                   1.000 0.000000
96
     56
               1.7143 0.03117 1
                                   1.000 0.000000
                                                        5.357 94.643 0.000
97
               1.7164 0.02601 1
                                   1.000 0.000000
                                                     0 13.433 86.567 0.000
     67
         115
      7
               0.8571 0.14286 1
                                   1.000 0.000000
                                                     0 14.286 85.714 0.000
98
           6
               0.7500 0.25000 1
                                                     0 25.000 75.000 0.000
99
      4
           3
                                   1.000 0.000000
100
     42
          42
               1.0000 0.02439 1
                                   1.000 0.000000
                                                        4.762 95.238 0.000
101
     31
              1.7419 0.05806 2
                                   1.054 0.034722
                                                        9.677 87.097 3.226
102
      4
              0.5000 0.16667 1
                                   1.000
                                              NaN
                                                     0 50.000 50.000 0.000
                                   1.000 0.000000
103
     29
              0.9310 0.03325 1
                                                     0 10.345 89.655 0.000
          27
104
      5
              0.8000 0.20000 1
                                   1.000 0.000000
                                                     0 20.000 80.000 0.000
     29
              1.3103 0.04680 1
                                                     0 10.345 89.655 0.000
105
          38
                                   1.000 0.000000
     50
         165
              3.3000 0.06735 2
                                   1.125 0.306778
                                                        4.000 88.000 8.000
106
107
      6
           5
              0.8333 0.16667 1
                                   1.000 0.000000
                                                     0 16.667 83.333 0.000
      9
              0.8889 0.11111 1
                                   1.000 0.000000
                                                     0 11.111 88.889 0.000
108
           8
109
     32
              1.0312 0.03327 2
                                   1.418 0.009119
                                                        0.000 93.750 6.250
110
     48
               1.3958 0.02970 1
                                   1.000 0.000000
                                                        6.250 93.750 0.000
111
     10
           9
               0.9000 0.10000
                                   1.000 0.000000
                                                     0 10.000 90.000 0.000
              1.0571 0.03109 1
                                                        5.714 94.286 0.000
     35
112
          37
                                   1.000 0.000000
                                                     0
113
     50
              1.1800 0.02408 2
                                   1.033 0.005515
                                                        8.000 88.000 4.000
     23
          42
              1.8261 0.08300 1
                                   1.000 0.000000
                                                        8.696 91.304 0.000
114
                                                     0
               1.6000 0.17778 1
                                                     0 20.000 80.000 0.000
115
     10
          16
                                   1.000 0.000000
116
     35
          34
              0.9714 0.02857 1
                                   1.000 0.000000
                                                        2.857 97.143 0.000
117 103
         205
              1.9903 0.01951 1
                                   1.000 0.000000
                                                     0 10.680 89.320 0.000
118
     32
          31
              0.9688 0.03125 1
                                   1.000 0.000000
                                                        3.125 96.875 0.000
              0.9000 0.10000 1
119
     10
                                   1.000 0.000000
                                                     0 10.000 90.000 0.000
120
     13
              0.9231 0.07692 1
                                   1.000 0.000000
                                                        7.692 92.308 0.000
                                                     0
121
     22
              1.2727 0.06061 1
                                   1.000 0.000000
                                                     0 13.636 86.364 0.000
122
      3
              0.6667 0.33333 1
                                   1.000 0.000000
                                                     0 33.333 66.667 0.000
```

```
0 75.000 25.000 0.000
123
     12
              1.3333 0.12121 1
                                   1.000 0.000000
     52
                                   1.000 0.000000
                                                        1.923 98.077 0.000
124
              0.9808 0.01923 1
125
     37
               1.0811 0.03003 2
                                   1.375 0.007874
                                                        5.405 91.892 2.703
              1.8400 0.07667 1
126
     25
          46
                                   1.000 0.000000
                                                        8.000 92.000 0.000
127
   125
         967
               7.7360 0.06239
                                   1.074 0.311741
                                                     4 36.800 56.000 7.200
     30
128
          29
              0.9667 0.03333 1
                                   1.000 0.000000
                                                     0
                                                        3.333 96.667 0.000
129
     31
          67
               2.1613 0.07204 1
                                   1.000 0.000000
                                                     0 25.806 74.194 0.000
              0.9231 0.07692 1
                                   1.000 0.000000
                                                        7.692 92.308 0.000
130
     13
          12
                                                     0
131
     30
              1.0000 0.03448 1
                                   1.000 0.000000
                                                     1
                                                        0.000 96.667 3.333
      5
              0.8000 0.20000 1
                                                     0 20.000 80.000 0.000
132
                                   1.000 0.000000
                                   1.000 0.000000
133
     11
              0.9091 0.09091 1
                                                        9.091 90.909 0.000
134
     30
          29
              0.9667 0.03333 1
                                   1.000 0.000000
                                                        3.333 96.667 0.000
135
      6
              0.8333 0.16667 1
                                   1.000 0.000000
                                                     0 16.667 83.333 0.000
           5
136
     19
               1.4211 0.07895 1
                                   1.000 0.000000
                                                     0 21.053 78.947 0.000
137
     21
          27
              1.2857 0.06429 1
                                   1.000 0.000000
                                                     0 19.048 80.952 0.000
138
      7
           6
               0.8571 0.14286 1
                                   1.000 0.000000
                                                     0 28.571 71.429 0.000
139
     18
          17
               0.9444 0.05556 1
                                   1.000 0.000000
                                                        5.556 94.444 0.000
140
     29
               1.6897 0.06034 1
                                   1.000 0.000000
                                                     0 27.586 72.414 0.000
              0.7500 0.25000
                                                     0 50.000 50.000 0.000
141
      4
           3
                                   1.000 0.000000
142
      6
           8
               1.3333 0.26667 1
                                   1.000 0.000000
                                                     0 33.333 66.667 0.000
143
     22
              2.3182 0.11039 1
                                   1.000 0.000000
                                                     0 31.818 68.182 0.000
                                                     0 50.000 50.000 0.000
144
      2
           1
               0.5000 0.50000 1
                                   1.000
                                               NaN
              0.6667 0.33333 1
145
      3
           2
                                   1.000 0.000000
                                                     0 33.333 66.667 0.000
146
      4
           3
               0.7500 0.25000 1
                                   1.000 0.000000
                                                     0 25.000 75.000 0.000
147
     22
          22
              1.0000 0.04762 1
                                   1.000 0.000000
                                                        0.000 95.455 4.545
148
               0.7500 0.25000 1
                                   1.000 0.000000
                                                     0 25.000 75.000 0.000
     27
              0.9630 0.03704 1
                                                        3.704 96.296 0.000
149
          26
                                   1.000 0.000000
150
      9
           8
               0.8889 0.11111 1
                                   1.000 0.000000
                                                     0 11.111 88.889 0.000
           7
151
      8
               0.8750 0.12500 1
                                   1.000 0.000000
                                                     0 12.500 87.500 0.000
              0.8889 0.11111 1
                                   1.000 0.000000
                                                     0 22.222 77.778 0.000
152
      9
           8
153
      4
           3
               0.7500 0.25000 1
                                   1.000 0.000000
                                                     0 25.000 75.000 0.000
           5
              0.8333 0.16667 1
                                   1.000 0.000000
                                                     0 16.667 83.333 0.000
154
      6
155
      8
              1.5000 0.21429 1
                                   1.000 0.000000
                                                     0 37.500 62.500 0.000
                                                        2.083 97.917 0.000
156
     48
              0.9792 0.02083 1
                                   1.000 0.000000
157
     32
               0.9688 0.03125
                                   1.000 0.000000
                                                        3.125 96.875 0.000
              0.9697 0.03030 1
     33
                                                        3.030 96.970 0.000
158
          32
                                   1.000 0.000000
                                                     0
159
     30
               0.9667 0.03333 1
                                   1.000 0.000000
                                                        3.333 96.667 0.000
160
              0.9091 0.09091 1
                                   1.000 0.000000
                                                        9.091 90.909 0.000
     11
          10
                                                     0
     22
               0.9545 0.04545
                                                     0 18.182 77.273 4.545
161
                                   1.764 0.000000
162
     25
          34
              1.3600 0.05667 2
                                   1.029 0.061644
                                                     0 24.000 72.000 4.000
163
      2
           1
              0.5000 0.50000 1
                                   1.000
                                               NaN
                                                     0 50.000 50.000 0.000
164
     30
          29
              0.9667 0.03333
                                   1.000 0.000000
                                                        3.333 96.667 0.000
                                                     0
165
     14
              0.9286 0.07143
                                   1.000 0.000000
                                                     0
                                                        7.143 92.857 0.000
     14
              0.9286 0.07143 1
                                   1.000 0.000000
                                                     0
                                                        7.143 92.857 0.000
166
167
     72
          75
              1.0417 0.01467 2
                                   1.051 0.000000
                                                     1
                                                        5.556 91.667 2.778
              1.1071 0.02013 1
                                                        3.571 96.429 0.000
168
     56
          62
                                   1.000 0.000000
                                                     0
```

```
169
     46
         201
              4.3696 0.09710 1
                                   1.000 0.000000
                                                     0 19.565 80.435 0.000
         378
     41
                                                     0 34.146 65.854 0.000
170
              9.2195 0.23049 1
                                   1.000 0.000000
171
      5
               1.0000 0.25000 1
                                   1.000 0.000000
                                                     0 40.000 60.000 0.000
           5
172
     55
         756 13.7455 0.25455 1
                                   1.000 0.000000
                                                     0 50.909 49.091 0.000
173
     24
          52
               2.1667 0.09420
                                   1.000 0.000000
                                                     0 33.333 66.667 0.000
174
      7
           6
              0.8571 0.14286 1
                                   1.000 0.000000
                                                     0 14.286 85.714 0.000
175
      3
           2
              0.6667 0.33333 1
                                   1.000 0.000000
                                                     0 33.333 66.667 0.000
176
      2
               0.5000 0.50000 1
                                                     0 50.000 50.000 0.000
           1
                                   1.000
                                               NaN
               1.1207 0.01966 2
177
     58
          65
                                   1.030 0.013663
                                                        1.724 96.552 1.724
     95
              1.2000 0.01277 2
                                   1.333 0.015446
                                                        0.000 97.895 2.105
178
         114
              1.2500 0.08333 1
179
     16
          20
                                   1.000 0.000000
                                                     0 12.500 87.500 0.000
180
     29
          50
               1.7241 0.06158 1
                                   1.000 0.000000
                                                     0 31.034 68.966 0.000
181
     34
          73
              2.1471 0.06506 1
                                   1.000 0.000000
                                                     0 20.588 79.412 0.000
182
     12
          20
              1.6667 0.15152 1
                                   1.000 0.000000
                                                     0 16.667 83.333 0.000
183
      8
           9
              1.1250 0.16071 1
                                   1.000 0.000000
                                                     0 25.000 75.000 0.000
184
      6
           4
               0.6667 0.13333 1
                                   1.000 0.000000
                                                     0 33.333 66.667 0.000
         527
185
   160
               3.2938 0.02072 2
                                   1.165 0.069385
                                                     2 16.875 75.000 8.125
186
     34
          34
              1.0000 0.03030 1
                                   1.000 0.000000
                                                        0.000 97.059 2.941
                                                     0 17.391 82.609 0.000
187
     46
          67
               1.4565 0.03237
                                   1.000 0.000000
188
      3
               0.6667 0.33333
                                   1.000 0.000000
                                                     0 33.333 66.667 0.000
     10
              1.2000 0.13333 1
                                   1.000 0.000000
                                                     0 20.000 80.000 0.000
189
              2.6842 0.14912 1
                                                     0 73.684 26.316 0.000
190
     19
                                   1.000 0.000000
                                                        6.667 93.333 0.000
191
     15
              0.9333 0.06667 1
                                   1.000 0.000000
                                                     0
          14
     27
192
          46
               1.7037 0.06553 2
                                   1.098 0.000000
                                                     0 22.222 74.074 3.704
193
     24
          35
              1.4583 0.06341 1
                                   1.000 0.000000
                                                     0 16.667 83.333 0.000
194
      4
              0.7500 0.25000 1
                                   1.000 0.000000
                                                     0 25.000 75.000 0.000
195
      3
              0.6667 0.33333 1
                                                     0 33.333 66.667 0.000
                                   1.000 0.000000
196
     15
          17
               1.1333 0.08095 1
                                   1.000 0.000000
                                                     0 46.667 53.333 0.000
              1.3333 0.02151 1
197
     63
          84
                                   1.000 0.000000
                                                     0
                                                        6.349 93.651 0.000
198
     12
              0.9167 0.08333 1
                                   1.000 0.000000
                                                     0
                                                        8.333 91.667 0.000
          11
199
     41
          40
               0.9756 0.02439 1
                                   1.000 0.000000
                                                     0
                                                        2.439 97.561 0.000
      5
           4
              0.8000 0.20000 1
                                   1.000 0.000000
                                                     0 20.000 80.000 0.000
200
201
      4
              0.7500 0.25000 1
                                   1.000 0.000000
                                                     0 25.000 75.000 0.000
202
     24
          23
              0.9583 0.04167
                                   1.000 0.000000
                                                        4.167 95.833 0.000
203
      2
               0.5000 0.50000
                                   1.000
                                               NaN
                                                     0 50.000 50.000 0.000
           1
     23
                                                        4.348 95.652 0.000
                                   1.000 0.000000
204
          22
               0.9565 0.04348
                                                     0
205
               0.7500 0.25000 1
                                   1.000 0.000000
                                                     0 25.000 75.000 0.000
      4
206
      2
               0.5000 0.50000 1
                                                     0 50.000 50.000 0.000
                                   1.000
                                               NaN
           1
207
               0.9286 0.07143
                                   1.000 0.000000
                                                        7.143 92.857 0.000
     14
          13
208
     11
              0.9091 0.09091 1
                                   1.000 0.000000
                                                     0
                                                        9.091 90.909 0.000
209
     23
              0.9130 0.04150
                                   1.000 0.000000
                                                        8.696 91.304 0.000
              0.9737 0.02632 1
                                                        2.632 97.368 0.000
210
     38
          37
                                   1.000 0.000000
                                                     0
              0.8750 0.12500
211
      8
           7
                                   1.000 0.000000
                                                     0 12.500 87.500 0.000
     83
              0.9759 0.01190 2
                                   1.036 0.000000
                                                        2.410 96.386 1.205
212
                                                     0
213
      7
           6
              0.8571 0.14286 1
                                   1.000 0.000000
                                                     0 14.286 85.714 0.000
              0.8000 0.20000 1
                                   1.000 0.000000
                                                     0 40.000 60.000 0.000
214
      5
           4
```

```
215
     27
              1.2593 0.04843 1
                                  1.000 0.000000
                                                    0 11.111 88.889 0.000
     32
              6.1250 0.19758 1
                                  1.000 0.339161
                                                    3 12.500 78.125 9.375
         196
216
              0.8750 0.12500 1
                                  1.000 0.000000
                                                    0 12.500 87.500 0.000
217
218
      3
              0.6667 0.33333 1
                                  1.000 0.000000
                                                    0 33.333 66.667 0.000
219
     22
          21
              0.9545 0.04545 1
                                  1.000 0.000000
                                                       4.545 95.455 0.000
220
     24
              0.9583 0.04167 1
                                  1.000 0.000000
                                                       4.167 95.833 0.000
221
     33
              0.9697 0.03030 1
                                  1.000 0.000000
                                                       3.030 96.970 0.000
222
              1.0667 0.07619 1
                                  1.000 0.000000
                                                    0 26.667 73.333 0.000
     15
          16
223
     11
          10
              0.9091 0.09091 1
                                  1.000 0.000000
                                                       9.091 90.909 0.000
224
     18
          28
              1.5556 0.09150 1
                                  1.000 0.000000
                                                    0 27.778 72.222 0.000
225
     18
          25
              1.3889 0.08170 1
                                  1.000 0.000000
                                                    0 22.222 77.778 0.000
226
     20
          26
              1.3000 0.06842 1
                                  1.000 0.000000
                                                    0 30.000 70.000 0.000
227
     12
              1.5000 0.13636 1
                                  1.000 0.000000
                                                    0 25.000 75.000 0.000
          18
228
              0.7778 0.09722 1
                                  1.000 0.000000
                                                    0 22.222 77.778 0.000
```

Because there are so many different locations (228) the dataframe of web properties becomes a bit unwieldy. Plotting the different indices is a useful way to examine some of the properties of the different locations' food webs. First, a histogram of the number of nodes (N) in each web shows that most of the webs invovle less than 50 species, but a few are greater than 150 species.

```
ggplot(web.props1) + geom_histogram(aes(x = N), binwidth = 5)
```

A plot of connectance (C) against size (N) shows the expected relationship of a decline in connectance with size. It is also evident that most of the food webs in this study have a connectance less than 0.1. A number of webs have a connectance of 0.5, but those represent the locations with webs that are only two species with one interaction.

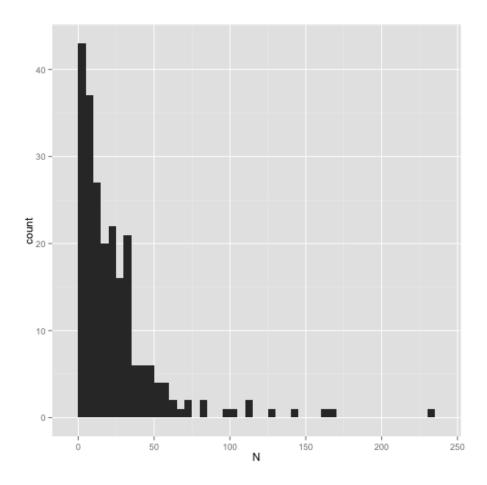


Figure 5: plot of chunk unnamed-chunk-9

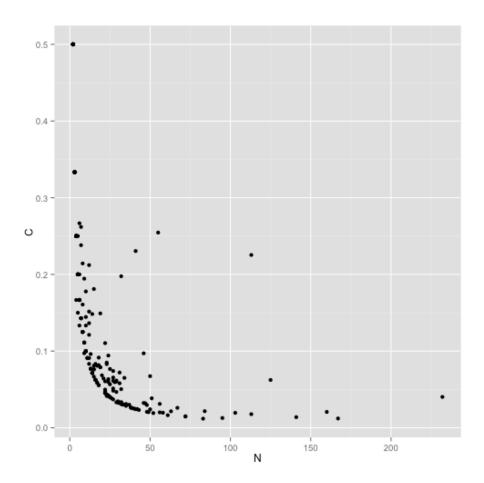


Figure 6: plot of chunk unnamed-chunk-10

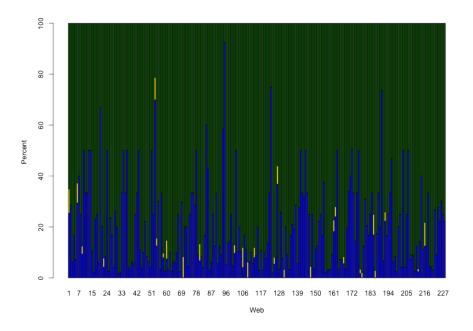


Figure 7: plot of chunk unnamed-chunk-11

## By year

```
so.ode <- as.character(s.ocean$OBSERVATION_DATE_END)
so.ode.split <- strsplit(so.ode, split = "/")

year <- c()
for (i in 1:length(so.ode.split)) {
    year[i] <- so.ode.split[[i]][3]
}
s.ocean2 <- cbind(s.ocean, year)

m2 <- split(s.ocean2, f = s.ocean2$year)
year.g <- list()
for (i in 1:length(levels(s.ocean2$year))) {
    el.df <- data.frame(pred = m[[i]]$PREDATOR_NAME, prey = m[[i]]$PREY_NAME)
    g <- graph.edgelist(unique(as.matrix(el.df[, 1:2])))
    year.g[[i]] <- g
}</pre>
```

Plot webs by year

```
par(mfrow = c(23, 2), mar = c(0.01, 0.01, 0.01, 0.01))
for (i in 1:45) {
    plot.igraph(year.g[[i]], layout = layout.circle, edge.arrow.size = 0.5,
        vertex.label = NA, vertex.size = 5)
    text(0, 0, label = levels(s.ocean2$year)[i], cex = 2)
}
```

