

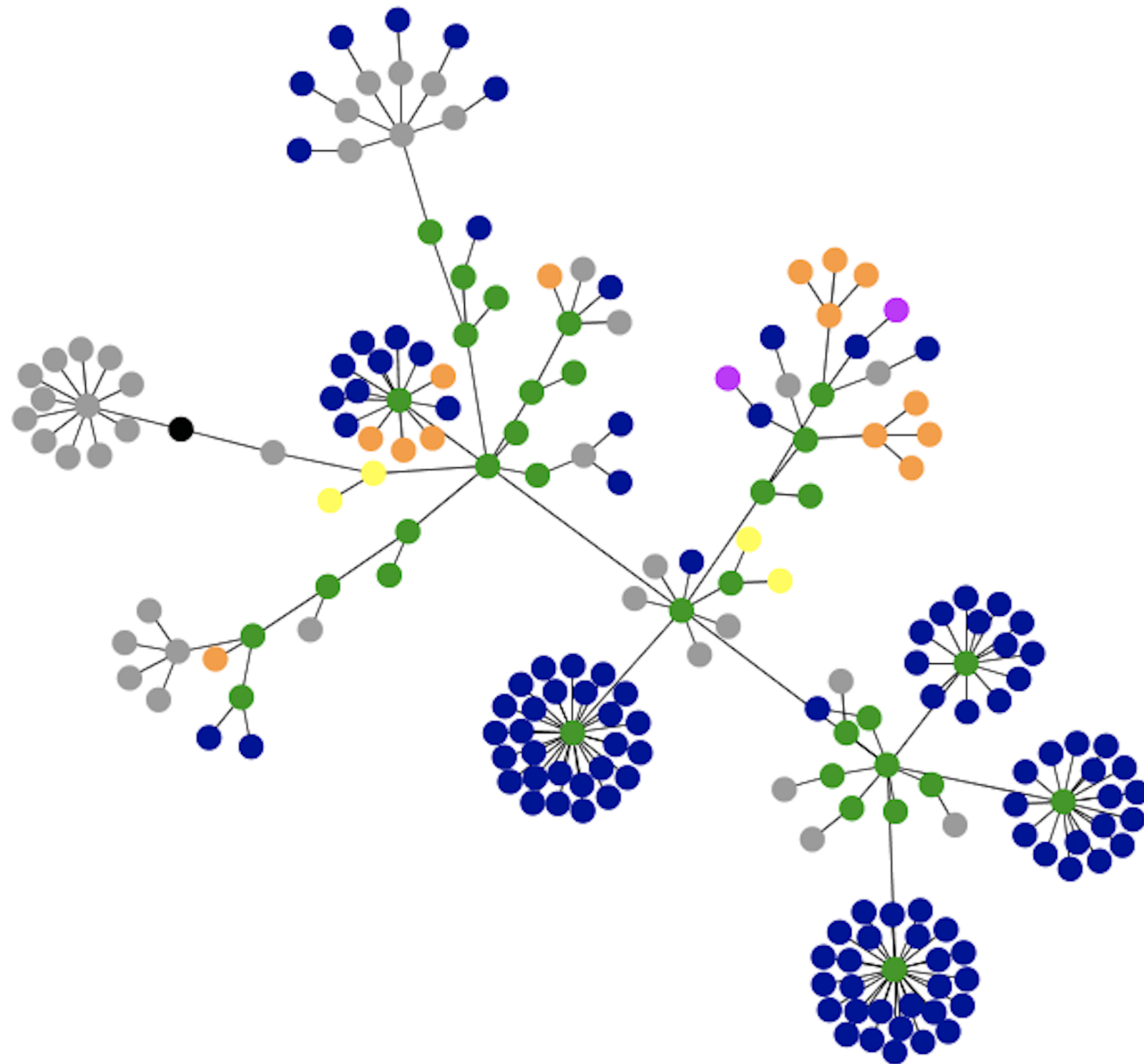


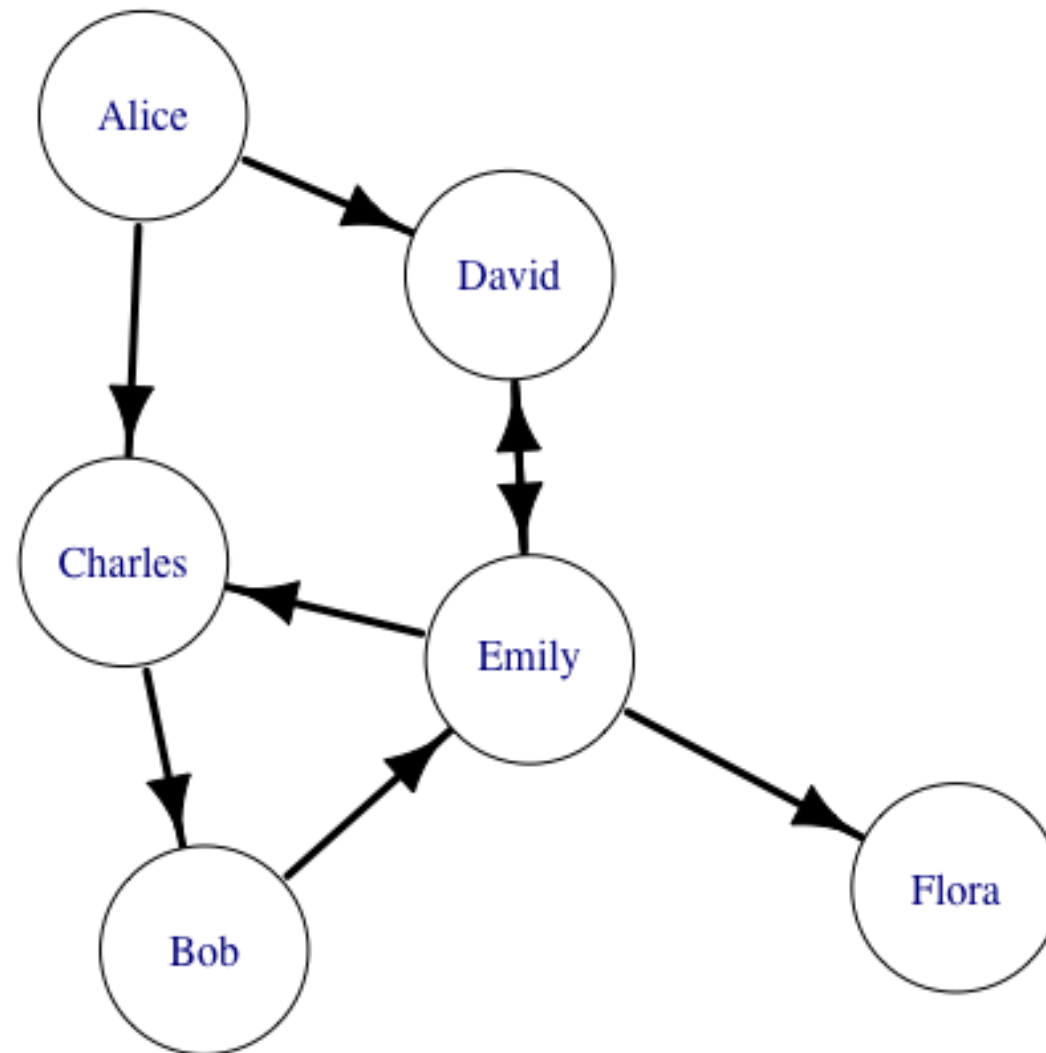
NETWORK ANALYSIS IN THE TIDYVERSE

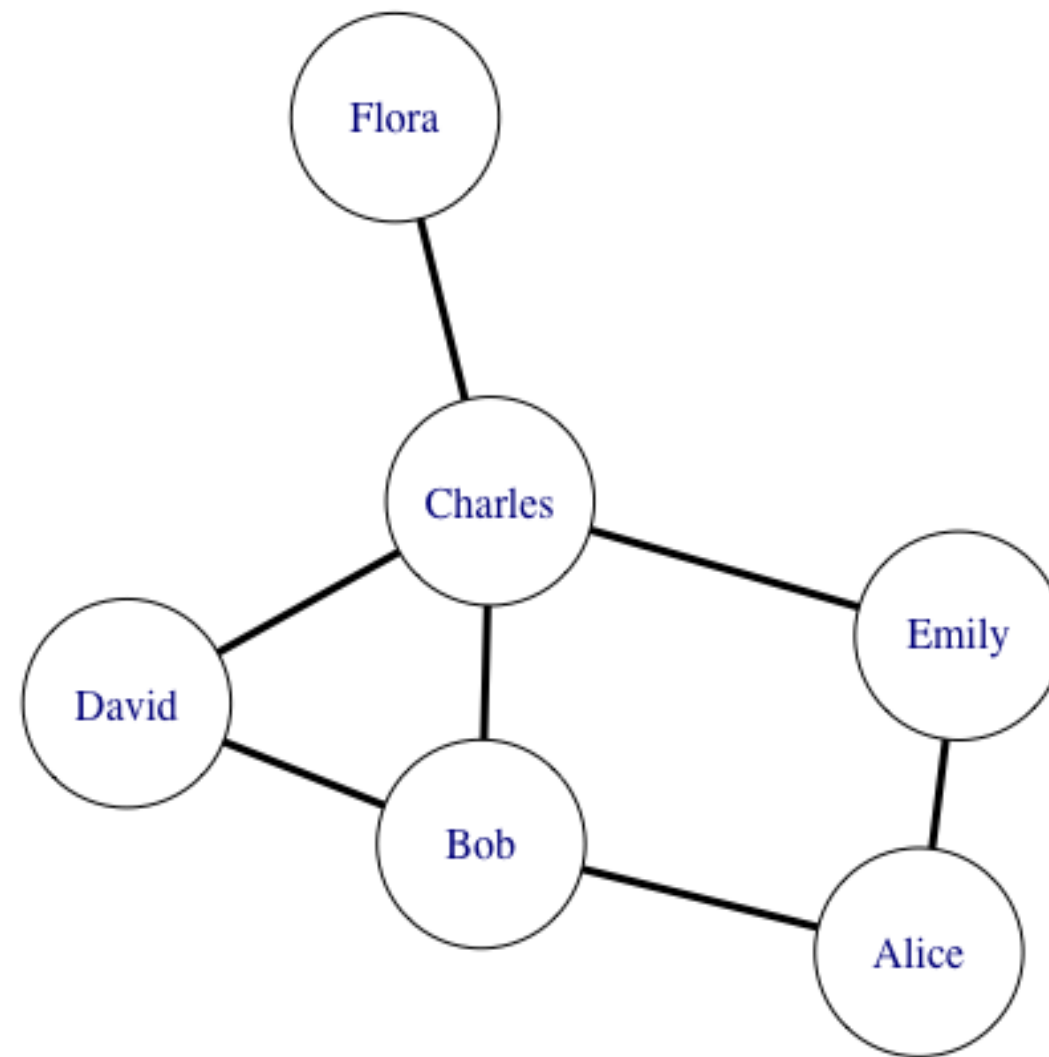
Network analysis in R: A tidy approach

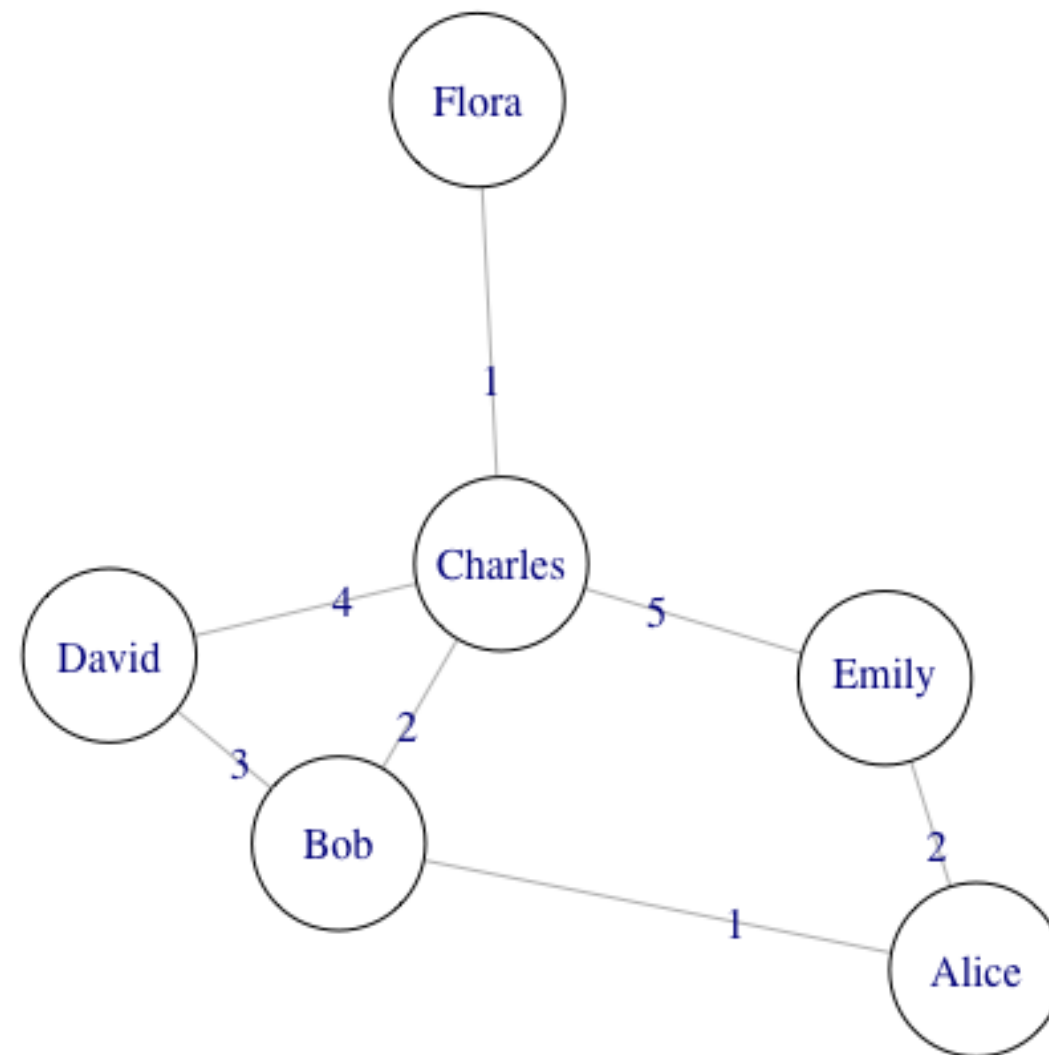
Massimo Franceschet

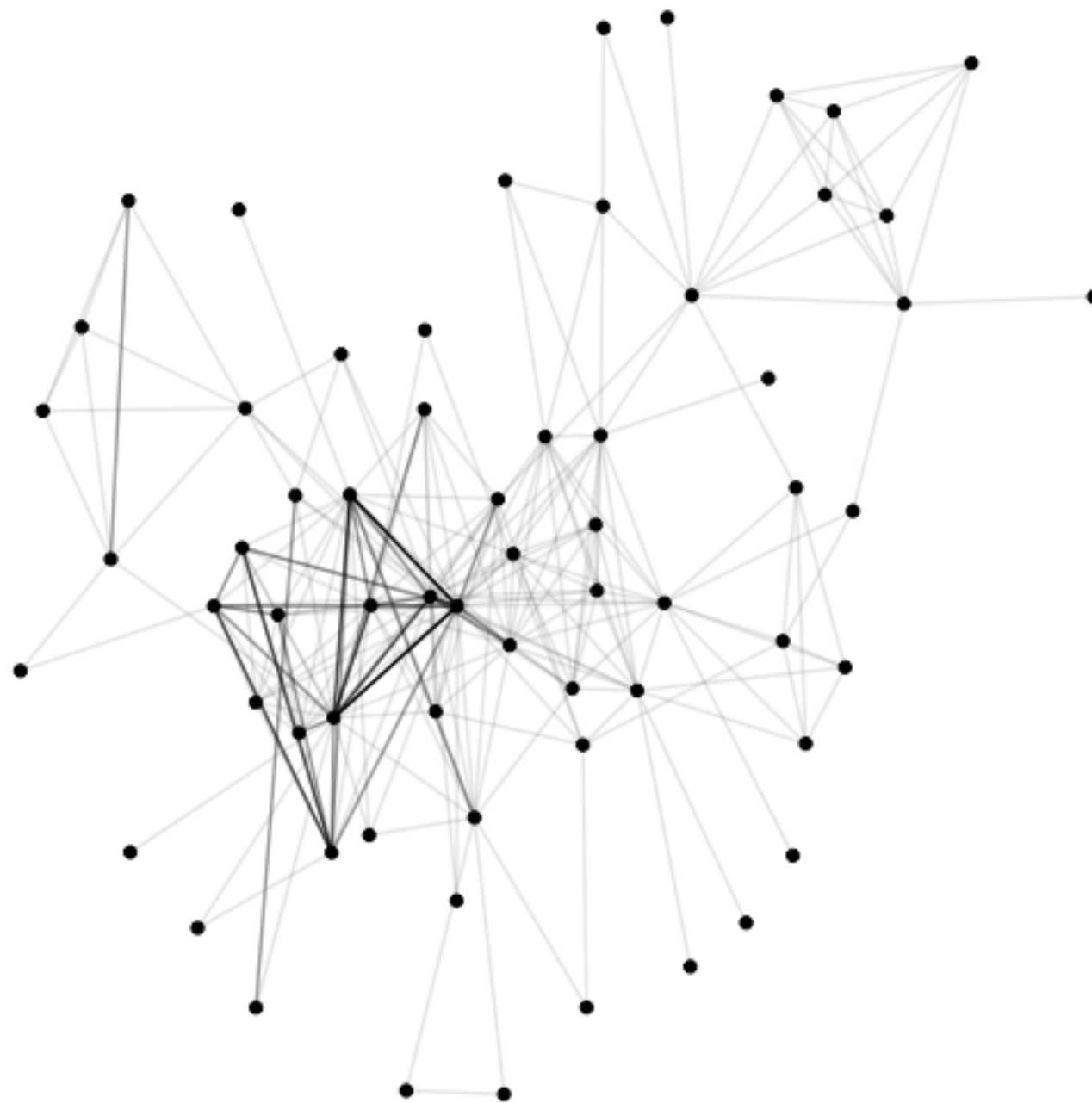
Prof. of Data Science, University of Udine (Italy)













Building the network

```
# load packages for network exploration
library(readr)
library(igraph)
```

```
# read nodes and ties data into variables
nodes <- read_csv("nodes.csv")
ties <- read_csv("ties.csv")
```

```
# build a network from data frames
g <- graph_from_data_frame(d = ties,
                           directed = FALSE,
                           vertices = nodes)
```

Exploring the network

```
# explore the set of nodes and print the number of nodes
V(g)
vcount(g)
```

```
# explore the set of ties and print the number of ties
E(g)
ecount(g)
```

```
# add the name attribute "Madrid network" to the network and print it
g$name <- "Madrid network"
g$name
```

```
# add node attribute id and print the node `id` attribute
V(g)$id <- 1:vcount(g)
```

```
# print the tie `weight` attribute
E(g)$weight
```




NETWORK ANALYSIS IN THE TIDYVERSE

Let's start the investigation!



NETWORK ANALYSIS IN THE TIDYVERSE

Visualizing networks



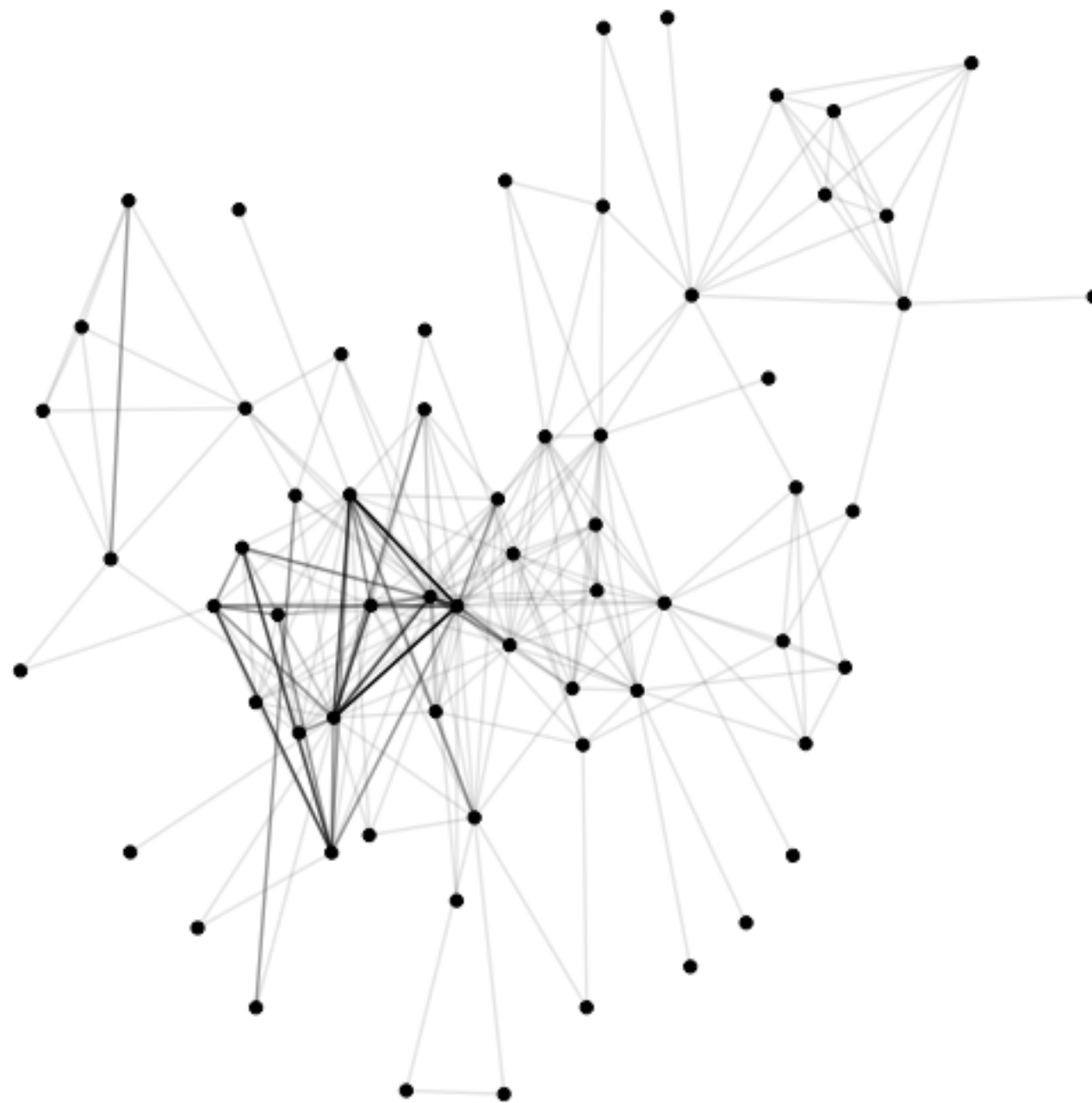
ggraph()

```
# load packages for data manipulation and visualization
library(igraph)

library(dplyr)
library(ggplot2)

library(gggraph)
```

```
# visualize the network
gggraph(g, layout = "with_kk") +
  geom_edge_link(aes(alpha = weight)) +
  geom_node_point()
```





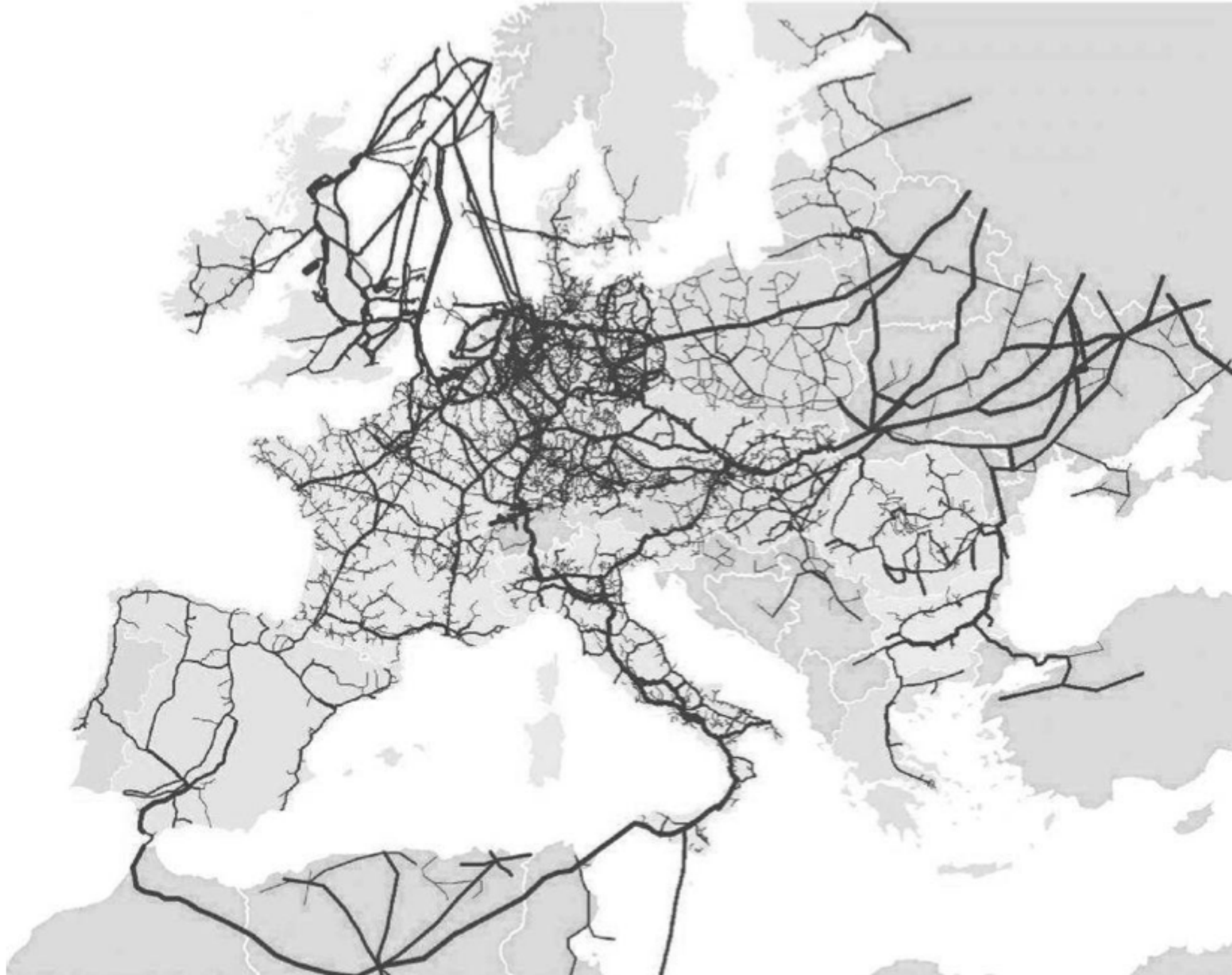
NETWORK ANALYSIS IN THE TIDYVERSE

Let's practice!



NETWORK ANALYSIS IN THE TIDYVERSE

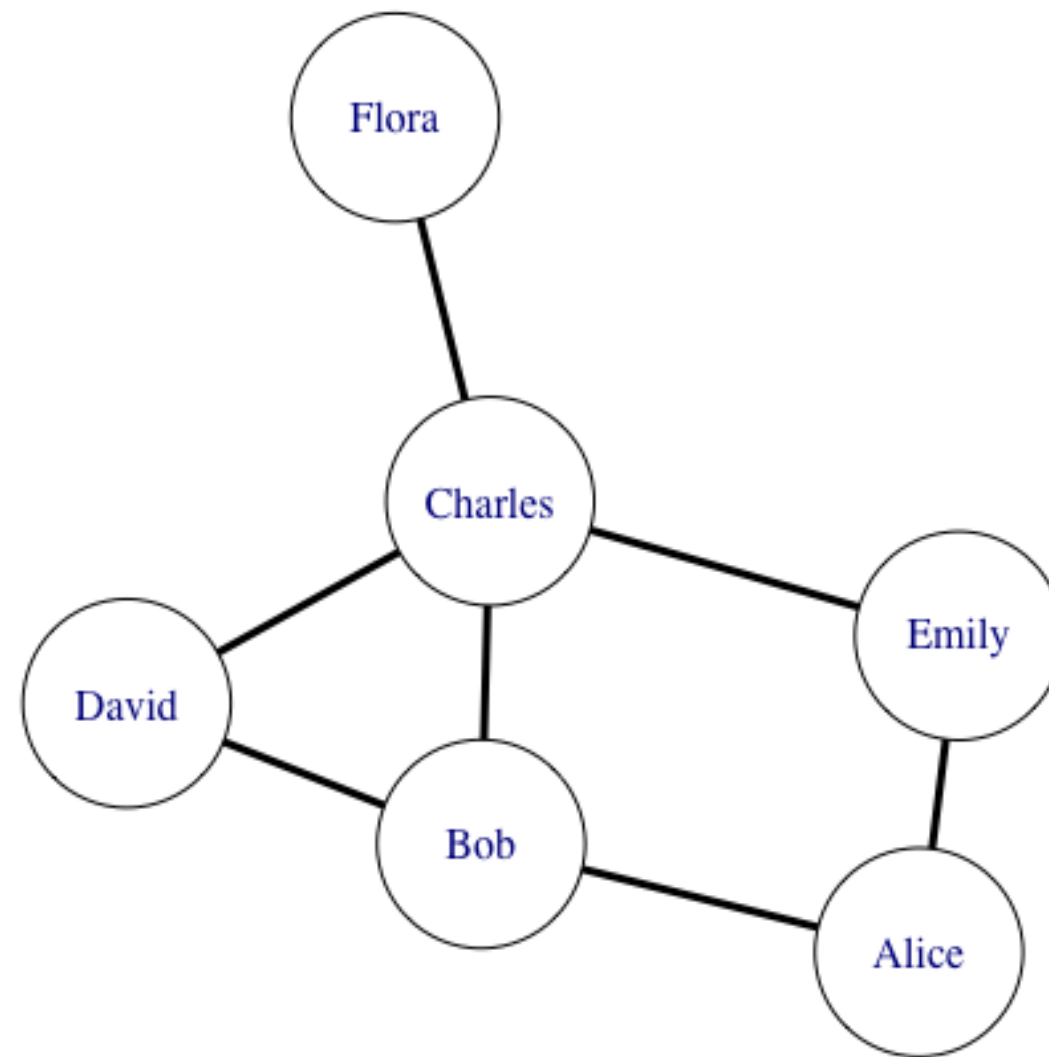
Centrality measures





Node centrality

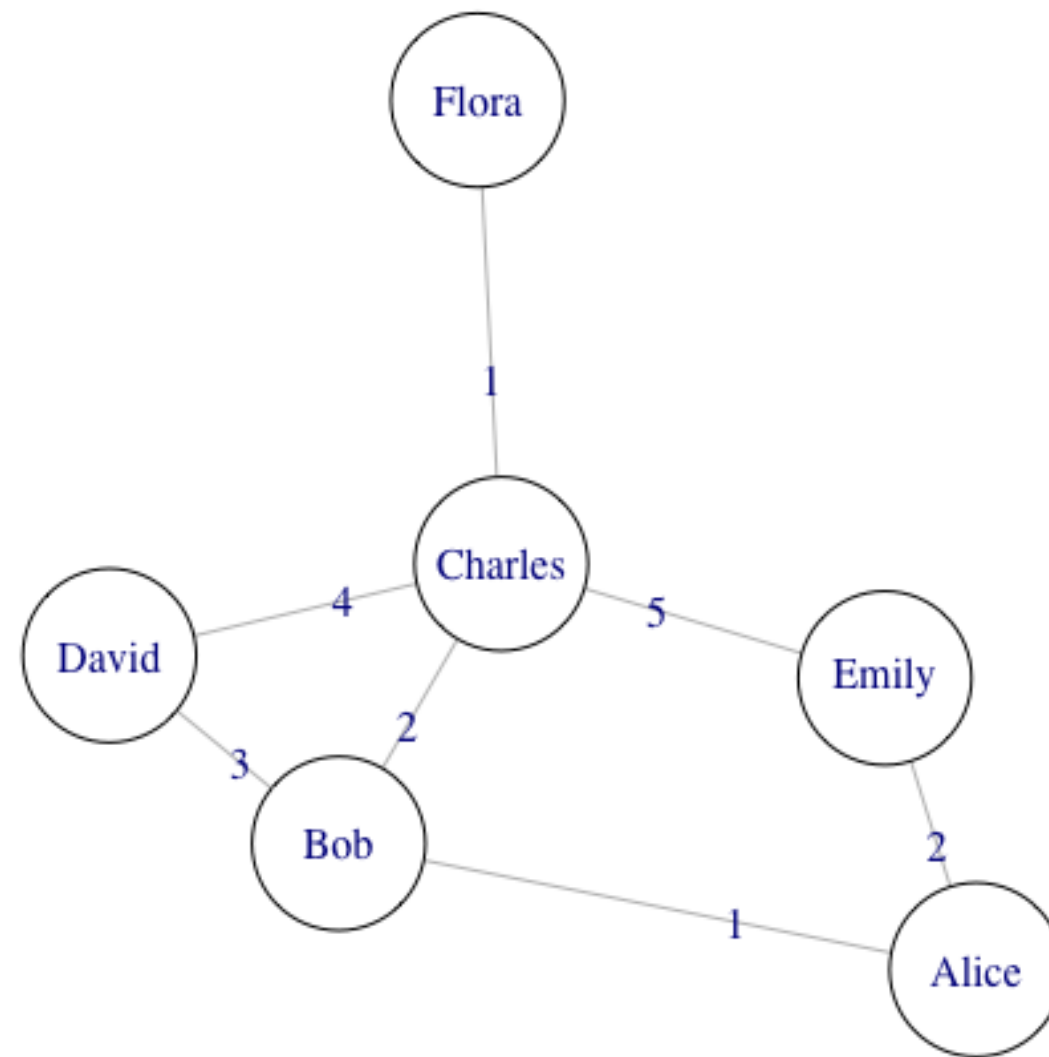
- Which are the most important nodes in a network?
 - Important web pages about a certain topic
 - Influential academic papers covering a given issue
 - Internet routers whose failure would greatly affect network connectivity



Computing degree

```
# compute node degrees  
degree(g)
```

| | | |
|--------------------|--------------------|---------------------|
| Jamal Zougam | Mohamed Bekkali | Mohamed Chaoui |
| 29 | 2 | 27 |
| Vinay Kholy | Suresh Kumar | Mohamed Chedadi |
| 10 | 10 | 7 |
| Imad Eddin Barakat | Abdelaziz Benyaich | Abu Abderrahame |
| 22 | 6 | 4 |
| Omar Dhegayes | Amer Azizi | Abu Musad Alsakaoui |
| 2 | 18 | 10 |
| Mohamed Atta | Ramzi Binalshibh | Mohamed Belfatmi |
| 10 | 10 | 11 |
| Said Bahaji | Galeb Kalaje | Abderrahim Zbakh |
| 11 | 16 | 15 |





Computing strength

```
# compute node strengths  
strength(g)
```

| | | |
|--------------------|--------------------|---------------------|
| Jamal Zougam | Mohamed Bekkali | Mohamed Chaoui |
| 43 | 2 | 34 |
| Vinay Kholy | Suresh Kumar | Mohamed Chedadi |
| 10 | 10 | 7 |
| Imad Eddin Barakat | Abdelaziz Benyaich | Abu Abderrahame |
| 35 | 7 | 4 |
| Omar Dhegayes | Amer Azizi | Abu Musad Alsakaoui |
| 3 | 27 | 10 |
| Mohamed Atta | Ramzi Binalshibh | Mohamed Belfatmi |
| 12 | 14 | 19 |
| Said Bahaji | Galeb Kalaje | Abderrahim Zbakh |
| 17 | 21 | 15 |



NETWORK ANALYSIS IN THE TIDYVERSE

**Let's find the most central
terrorists in the network!**