Practical session

Graph models

Fabien Tarissan

In the following we represent networks by graphs. We denote a graph G = (V, E), where V is the set of vertices (also called nodes) of the graph and E is the set of links (also called edges).

1 Graph properties

Choose a network, described as a list of links. You can either :

— use the protein-protein interaction network of the drosophila :

see http://tarissan.complexnetworks.fr/iaml/drosophila_PPI.txt

- choose one from a database :
 - http://konect.cc/
 - http://snap.stanford.edu/data/
 - http://networkrepository.com/
 - https://github.com/awesomedata/awesome-public-datasets
- ... — take one of your own

In the following, we will consider the protein-protein interaction network (referred to as PPI-DROSO from now on).

Exercise 1 — *Getting started.* Downlod the following files :

```
http://tarissan.complexnetworks.fr/iaml/sandbox.py
http://tarissan.complexnetworks.fr/iaml/plotdist.py
Use those files to :
```

- 1. Compute the basic statistics of your network : number of nodes and edges, density, average degree, highest degree, clustering coefficient, the degree distribution.
- 2. Display the degree distribution of the network

2 Erdös-Rényi random graphs

Exercise 2 — *Generation.* Create a program which, given two integers n and m generates an Erdös-Rényi random graph with n nodes and m edges and writes the list of edges in a file. Multiple edges are allowed, but not loops.

Exercise 3 — *Characteristics*. Using the previously defined programs,

- 1. Generate an Erdös-Rényi graph with the same size of your network (ie. n = 7236 nodes and m = 22270 edges for PPI-DROSO).
- 2. Compute the basic features of this graph
- 3. Display the degree distribution of this graph.
- 4. Comment these results.
- 5. Compare the measurements obtained on your network with those made on the Erdös-Rényi graph. Comment.

3 Random graphs with fixed degree distribution

Exercise 4 — *Generation using direct method* We first generate a random graphs with a fixed degree distribution using the direct method, that is the configuration model.

- 1. Create a program which, given a degree list, creates a random graph with a similar degree list using the configuration model seen during the course.
- 2. Extract the degree list of network to generate a random graph with a similar degree distribution.

Exercise 5 — *Generation using switching method* Now, we implement the switching method.

- 1. Create a program which, given a real graph, achieves S random switches of links ends. Take good care that switches do not create any loop or multiple edge.
- 2. Starting from your network, realize $S = 10^6$ permutations, and writes the result in a file the list of edges obtained.
- 3. Add to the code a way to measure the clustering of the graph every 10⁴ switches, and to write in a file the value of the clustering throughout the process.
- 4. Plot the corresponding values obtained with your network and comment the results.

Exercise 6 — *Comparisons.* We now have two random graphs with the same degree distribution as your network.

- 1. Compare these two graphs using the important features previously cited : are they identical? If not, what is different from one to the other?
- 2. Compare the measurements obtained on your network with those made on the graph generated using the configuration model. Comment.

4 Barabási-Albert random graphs

Exercise 7 — *Barabási-Albert graph generation.* Create a program generating a graph according to Barabási-Albert method such that :

- 1. the graph is built by adding n nodes to the initial graph, the initial graph will be given as an input of the program,
- 2. any node is connected to m' nodes of the existing graph according to the preferential attachment rule, m' is an input parameter of the program too.
- **Exercise 8** *Comparison to* ppi-droso *drosophila network.* Use the previous algorithm to generate a scale-free Barabási-Albert network with similar number of nodes than your network, according to the following indications :
 - 1. use as an initial graph the 4 nodes graph containing the following edges :
 - $0 \ 1$

 $1\ 2$

 $2\ 3$

2. set the value of m in such a way that the density is of the same order as the density of your network.

Compare the structure of the graph obtained to the one of your network. Comment.

5 Watts-Strogatz random graphs

Exercise 9 — *Open question.* Suppose that you want to compare the structure of your network to a Watts-Strogatz network with comparable size and density.

- 1. Describe how you would proceed. (Meaning how would you choose the characteristics to generate the graph?)
- 2. Implement the solution that you proposed and then discuss the results.