

Social Networks & Recommendation Systems

V. Static random graphs.

Grzegorz Siudem

Warsaw University of Technology



**European
Funds**
Knowledge Education Development

**Warsaw University
of Technology**

European Union
European Social Fund



MSc program in Data Science has been developed
as a part of task 10 of the project
„NERW PW. Science - Education - Development - Cooperation”
co-funded by European Union from European Social Fund.

Project

Networks with given hamiltonian

Let us consider the space of every possible graph with N vertices
i.e. set $M_N = \mathbb{M}^{N \times N}(\{0, 1\})$. We want to define a probability
distribution on it.

We maximize entropy:

$$- \sum_{G \in M_N} \mathcal{P}(G) \ln \mathcal{P}(G),$$

Under certain condition $f(\mathcal{P}(G)) = 0$,

Which leads us to Lagrange multipliers

$$\mathcal{L}[\mathcal{P}(G)] = - \sum_{G \in M_N} \mathcal{P}(G) \ln \mathcal{P}(G) + \lambda f(\mathcal{P}(G))$$

It *only* remains to solve this equation

$$\frac{\partial \mathcal{L}}{\partial \mathcal{P}(G)} = 0.$$

Example - Exercise 1.

Implementation of $G_{N,p}$ version of ER graph – case study

Exercise 2.

Implement a function that returns the adjacency matrix of one realization of the ER graph with given values of N and p . Watch out for the trap!

Implementation of $G_{N,p}$ version of ER graph – case study

Exercise 2.

Implement a function that returns the adjacency matrix of one realization of the ER graph with given values of N and p . Watch out for the trap!

Exercise 3.

Draw resulting graph

Implementation of $G_{N,p}$ version of ER graph – case study

Exercise 2.

Implement a function that returns the adjacency matrix of one realization of the ER graph with given values of N and p . Watch out for the trap!

Exercise 3.

Draw resulting graph

Exercise 4.

Draw histogram of degree distribution.

Implementation of $G_{N,p}$ version of ER graph – case study

Exercise 2.

Implement a function that returns the adjacency matrix of one realization of the ER graph with given values of N and p . Watch out for the trap!

Exercise 3.

Draw resulting graph

Exercise 4.

Draw histogram of degree distribution.

Exercise 5.

What degree of vertex distribution do we expect?

Excercise 6.

Give the *mathematical* justification for the Poisson approximation used.

Excercise 6.

Give the *mathematical* justification for the Poisson approximation used.

Excercise 7.

Plot both the simulation results and analytically obtained distributions on one graph. Test appropriate hypotheses.

Excercise 6.

Give the *mathematical* justification for the Poisson approximation used.

Excercise 7.

Plot both the simulation results and analytically obtained distributions on one graph. Test appropriate hypotheses.

Excercises 8.

Checkdependence of the results of the previous excercise for various values of p and N .

Excercise 6.

Give the *mathematical* justification for the Poisson approximation used.

Excercise 7.

Plot both the simulation results and analytically obtained distributions on one graph. Test appropriate hypotheses.

Excercises 8.

Checkdependence of the results of the previous excercise for various values of p and N .

Attention!

Excercises 1-8 in total are worth 20% points for the project.

Assuming the Poisson approximation, we calculate the variance

$$\mathbb{E}(K) = \sum_{k=0}^{\infty} \frac{k e^{-\langle k \rangle} \langle k \rangle^k}{k!} = \dots = \langle k \rangle,$$

$$\mathbb{E}(K^2) = \sum_{k=0}^{\infty} \frac{k^2 e^{-\langle k \rangle} \langle k \rangle^k}{k!} = \dots = \langle k \rangle + \langle k \rangle^2.$$

$$\text{Var}(K) = \mathbb{E}(K^2) - [\mathbb{E}(K)]^2 = \langle k \rangle^2$$

P5.1 Complete the missing calculations.[10%]

Clustering coefficient

$$\langle C \rangle = p.$$

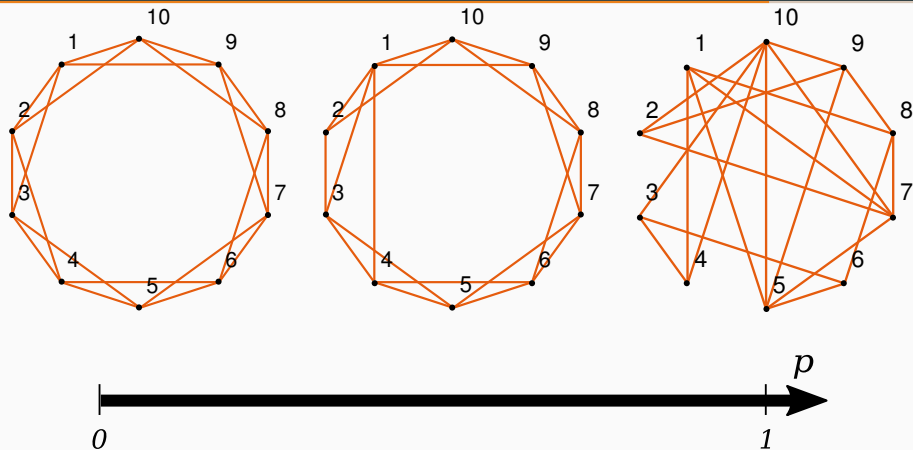
P5.2 Check the above analytical result by simulation. [20%]

ER model generalization

$$\begin{bmatrix} [p_{11}] & [p_{12}] & \dots & [p_{1N}] \\ [p_{21}] & [p_{22}] & \dots & [p_{2N}] \\ \dots & \dots & \ddots & \dots \\ [p_{N1}] & [p_{N2}] & \dots & [p_{NN}] \end{bmatrix}$$

P5.3 Generate and draw a graph consisting of 4 community each with $N = 20$ nodes and the probability of connection within the community higher than between them. Draw the result. How it depends on the parameter values? [40%]

Watts-Strogatz model



P5.4 Draw a graph of the averaged coefficient of clustering of the WS network against its parameter p . [30%]

- P5.5 With (or without) Mathematica solve ER model in the case of $G_{N,E}$. [50%]
- P5.6 Implement configuration model and test when the procedure converge. [50%]
- P5.7 Compute partition function and distribution of the network with given hamiltonian for the case with fixed number of edges. [50%]



**European
Funds**
Knowledge Education Development

**Warsaw University
of Technology**

European Union
European Social Fund



MSc program in Data Science has been developed
as a part of task 10 of the project
„NERW PW. Science - Education - Development - Cooperation”
co-funded by European Union from European Social Fund.