

Assignment of ET 4389

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I'm a guest student from the Radboud University. My TU Delft student number is 4524187, my official start date at the TU Delft is March 2016, however, I have not received my login details yet. Therefore, I've used my employee account (I'm also doing an internship here) for this assignment.

1)

G is the network described in `7.txt`.

- Number of nodes N : 379
- Number of links L : 914
- Link density p : 0.013
- Average degree $E[D]$: 4.82
- Degree variance $Var[D]$: 15.46

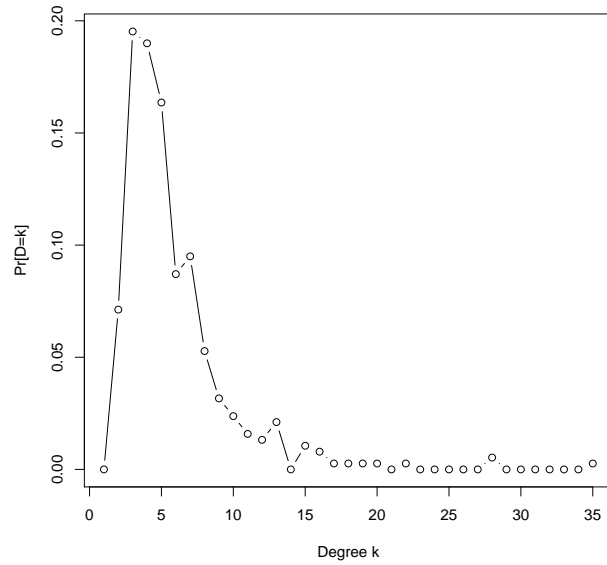


Figure 1: Degree distribution of Graph G

The degree distribution approximately follows a power law distribution; however, the degrees 1 and 2 are underrepresented – therefore, a lognormal distribution might be better suited. The fitting curve for the power law distribution, with $\gamma = -1.53$ is shown in Figure 2.

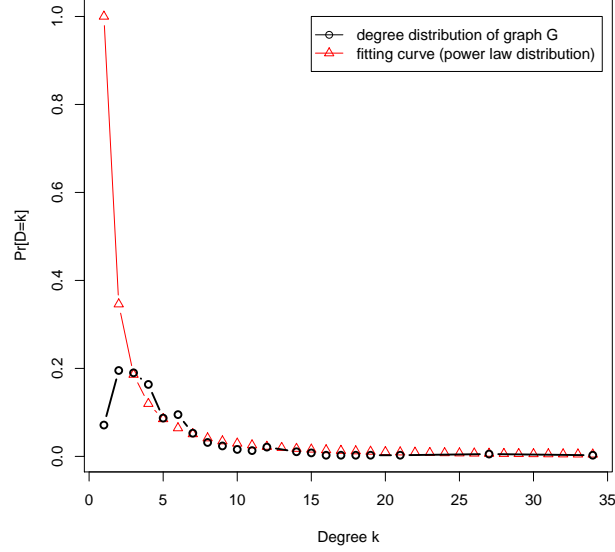


Figure 2: Fitting curve for graph G , with power exponent $\gamma = -1.53$.

2)

The scale-free property strongly correlates with the network's robustness to failure. It turns out that the major hubs are closely followed by smaller ones. These smaller hubs, in turn, are followed by other nodes with an even smaller degree and so on. This hierarchy allows for a fault tolerant behavior. If failures occur at random and the vast majority of nodes are those with small degree, the likelihood that a hub would be affected is almost negligible. Even if a hub-failure occurs, the network will generally not lose its connectedness, due to the remaining hubs. On the other hand, if we choose a few major hubs and take them out of the network, the network is turned into a set of rather isolated graphs. Thus, hubs are both a strength and a weakness of scale-free networks. These properties have been studied analytically using percolation theory by Cohen et al.[9][10] and by Callaway et al.[11]

- Degree correlation (assortativity) ρ_D : -0.30

Physical meaning:

Assortativity \sim *Birds of a feather flock together.*

Disassortativity \sim *Opposites attract.*

Networks, in which nodes with a high degree are likely connected to other high-degree nodes are *assortative*; networks in which nodes with a low degree are likely connected to high-degree nodes are *disassortative*.

3)

- Clustering coefficient: 0.17

4)

- Average hopcount $E[H]$: 3.75
- Diameter H_{max} : 7

5)

- Largest eigenvalue (spectral radius) λ_1 : 7.44

6)

- Second smallest eigenvalue (algebraic connectivity) of the Laplacian matrix μ_{N-1} : 0.40

7)

Now, we consider the network G_N , described in `NetScience.txt`.

- Number of nodes N : 379
- Number of links L : 914
- Link density p : 0.013
- Average degree $E[D]$: 4.82
- Degree variance $Var[D]$: 15.46
- Clustering coefficient C : 0.80
- Assortativity ρ_D : -0.08
- Average hopcount $E[H]$: 6.04
- Spectral radius λ_1 : 10.38
- Algebraic connectivity μ_{N-1} : 0.015
- Diameter H_{max} : 17

8)

I am discussing the metrics in the sense of “which network may allow information to propagate to a larger fraction of the network” and not, for example, “which network is better suited in case of attacks” or “which network might prevent the spread of a virus”.

Clustering coefficient C . The clustering coefficient C states how densely the neighbors of a node are connected. The physical meaning in a communication network is, are my partners also connected to each other. Here, G_N performs much better ($C(G) = 0.17 < C(G_N) = 0.80$), and is therefore better suited, since information can be sent on several channels. This makes the network more robust in case of failures (e.g. node/link removal).

Average hopcount $E[H]$. The average hopcount states the expected length of the shortest path between two nodes. The physical meaning in a communication network, this can be interpreted as the delay of the network. The smaller the average hopcount, the smaller the delay, and the faster messages can be sent between two partners. Since the average hopcount of H is 3.75, messages can be sent much faster than in G_N with a $E[H] = 6.04$.

Diameter H_{max} . The diameter of the communication network states how many edges a message needs to pass between two nodes in the worst case. Since a smaller H_{max} means faster communication in the worst case, G performs better ($H_{max}(G) = 7 < H_{max}(G_N) = 17$).

Spectral radius λ_1 . The spectral radius is important for dynamic processes in networks, for example, if, and how fast, a message might go “viral” but also how fast a virus might affect the network. The larger λ_1 , the lower the epidemic threshold τ_c . Regarding security, a higher λ_1 is better, therefore, G performs better ($\lambda_1(G) = 7.44 < \lambda_1(G_N) = 10.38$).

Algebraic connectivity μ_{N-1} . This metric states how well connected a graph is and, if the value is greater than zero, that the graph consists of one connected component. Since G has the higher connectivity, it performs better ($\mu_{N-1}(G) = 0.40 > \mu_{N-1}(G_N) = 0.015$).

All in all, I would recommend design G , and is better suited to convey information across the network. However, for a real network,

9)

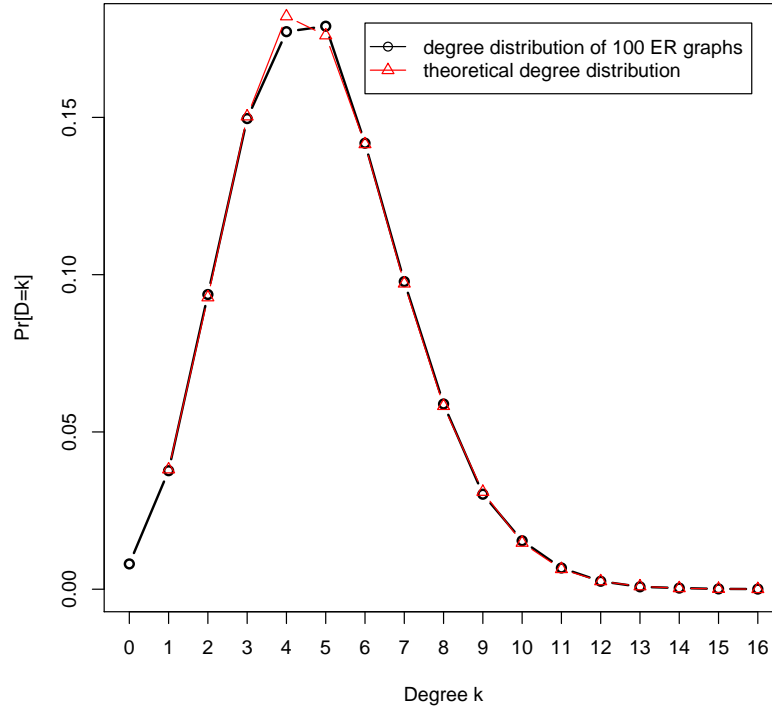


Figure 3: Comparison of the degree distribution of 100 ER instances and the theoretical degree distribution, where $Pr[D = k] = \binom{N-1}{k} p^k (1-p)^{N-1-k} = \binom{378}{k} 0.013^k \cdot 0.987^{378-k}$.

10)

Average of the metrics over the 100 ER random networks:

- Number of nodes N : 379
- Number of links L : 914.33
- Link density p : 0.012764
- Average degree $E[D]$: 4.824960
- Degree variance $Var[D]$: 4.774007

- Clustering coefficient: 0.012574
- Assortativity: -0.003513
- Average hopcount $E[H]$: 3.928829
- Spectral radius λ_1 : 6.006430
- Algebraic connectivity μ_{N-1} : 0.025853
- Diameter H_{max} : 7.980000

11)

Network	$E[n_{R_\infty}]$
G	
G_N	
100 ER	

Table 1: Average number ($E[n_{R_\infty}]$) of resistant nodes in the steady state for the different network models.

A final conclusion which network facilitates information propagation better is still difficult. We have a feeling of which network is better suited for information propagation. However, there are still limitations: for example the speed of information propagation. We know, how many nodes are infected in the $E[n_{R_\infty}]$ state, but not how fast that occurred.

Metric	G	G_N	100 ER
N	379	379	379
L	914	914	914.33
p	0.013	0.013	0.013
$E[D]$	4.82	4.82	4.82
$Var[D]$	15.46	15.46	4.77
C	0.17	0.80	0.01
ρ_D	-0.30	-0.08	0.00
$E[H]$	3.75	6.04	3.93
λ_1	7.44	10.38	6.01
μ_{N-1}	0.40	0.015	0.026
H_{max}	7	17	7.98

Table 2: Comparison of all metrics