

Class Network - Network Science

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Database description

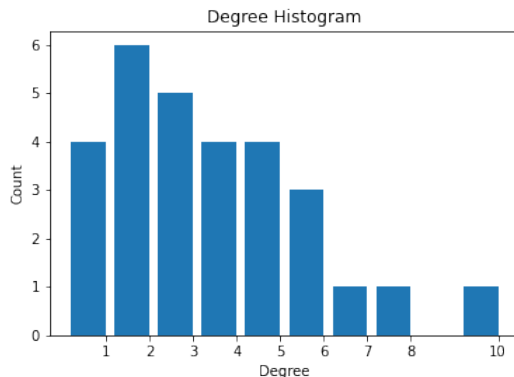
We asked the 15 students in the class to tell us their hobbies. A total of 14 distinct hobbies were mentioned, and led to the network given in the accompanying file class-network.tsv. This is a bipartite network, because each link has a student in one extremity and a hobby in the other. Both students and hobbies were anonymized, so students are identified by codes S1 to S15, whereas hobbies are identified by codes H1 to H14. The file has not been sorted.

Analysis

As described at the description, a bipartite graph was created, where students form a set and hobbies the other one. Since each student has one or more hobbies and each hobby is related to one or more students, an undirected network is formed. Additionally, it has 29 nodes and 55 links. Based on this, we're going to analyse the following items.

Analysing graph as a whole:

- (A) Degree distribution: Since the graph has two sets, we need to consider both of them to get the degree distribution. Moreover, the distribution is based on node's degree of each set. So, we have the following plot.



- (B) Average Degree: To compute the average degree, we can use the undirected network formula, defined by:

$$\langle k \rangle = \frac{2L}{N}$$

We also know that L is the number of links of this network and N is the number of nodes. Thus, we have:

$$\langle k \rangle = \frac{2 \times 55}{29} = \frac{110}{29} \approx 3.79$$

The same result is obtained with the code:

```
[IN] print(nx.info(bipartiteGraph))
[OUT] Name:
[OUT] Type: Graph
[OUT] Number of nodes: 29
[OUT] Number of edges: 55
[OUT] Average degree: 3.7931
```

- (C) Connected Components: Connected components are related for the number of subgraph within the network. Moreover, the number of components was analysed and only one was found. It is because all the links in the network is connected to a node that has at least one connection with a component. As a proof, we can calculate the size of this component, and if its size is equal to the number of links, so the premise is correct.

With the following piece of code we can verify it.

```
[IN] cc = nx.connected_components(G)
[IN] ncc = nx.number_connected_components(G)
[IN] sortedComponents = sorted(cc, key=len, reverse=True)
[IN] gc = G.subgraph(sortedComponents[0])
[IN] print("Number_of_connected_components:", ncc)
[IN] print("Size_of_the_giant_component:", gc.number_of_nodes())
[OUT] Number of connected components: 1
[OUT] Size of the giant component: 29
```

- (D) Average Distance: From the previous item, we got that the network is formed by one component. Furthermore, we can compute the average distance among nodes in the graph. The following code was used to compute it.

```
[IN] ad = nx.average_shortest_path_length(G)
[IN] print("Average_distance_within_the_graph:", ad)
[OUT] Average distance within the graph: 2.6995073891625614
```

- (E) Clustering coefficient: As described, we're working with a bipartite networks. So, hobbies nodes do not link among themselves, likewise for the students nodes. Nonetheless, the links between the two sets may create neighbours and also links among these neighbours. Hence, the following formula can compute the clustering coefficient for the whole graph:

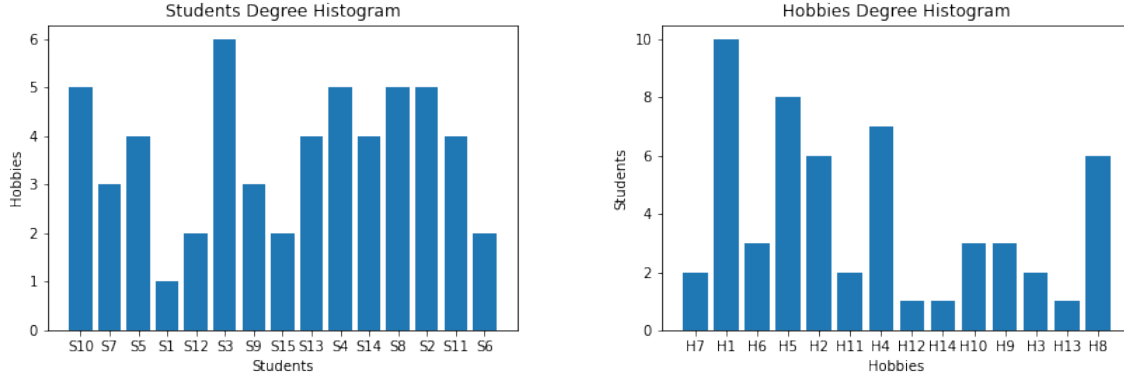
$$\langle C \rangle = \frac{1}{N} \sum_{v \in G} c_v$$

The following code computes it:

```
[IN] from networkx.algorithms import bipartite
[IN] wholeCC = bipartite.average_clustering(G)
[IN] print("Whole_Graph_Average_clustering_coef:", wholeCC)
[OUT] Whole Graph Average clustering coef: 0.25420638945679996
```

Analysing the students and hobbies projections

(A) Degree distribution: Considering the sets individually, we have the following distributions:



(B) Average Degree: To analyse the average degree for this set, we will base on the same formula described at item B for the graph as a whole.

$$\langle k \rangle = \frac{2L}{N}$$

Since the network has two sets, we can write the formula as the following, considering that N_1 is the number of students, N_2 is the number of hobbies, L_1 and L_2 is the number of links (degree sum) of each set. Moreover, $L_1 = L_2$, then:

$$\langle k \rangle = \frac{L_1 + L_2}{N_1 + N_2}$$

$$\langle k_{students} \rangle = \frac{L_1}{N_1} = \frac{55}{15} \approx 3.67$$

$$\langle k_{hobbies} \rangle = \frac{L_2}{N_2} = \frac{55}{14} \approx 3.92$$

(C) Connected components and Average Distance: Since the whole graph has only one component, then both sets also have only one component. Furthermore, the distances will also be the same as defined previously. By saying so, we have:

Number of components: 1
Average distance: 2.6995073891625614

(D) Clustering coefficient: Similar to previous definition, but considering only one set (X). To do so, we divide by the size (number of nodes) of the analysed set, not the size of the whole graph. Thus, we have:

$$\langle C_X \rangle = \frac{1}{|X|} \sum_{v \in G} c_v$$

The following code computes the coefficient for us:

```

[IN] from networkx.algorithms import bipartite
[IN] hobbies, students = bipartite.sets(G)
[IN] hobbiesCC = bipartite.average_clustering(G, hobbies)
[IN] studentsCC = bipartite.average_clustering(G, students)
[IN] print("Hobbies_Set_Average_clustering_coef:", hobbiesCC)
[IN] print("Students_set_Average_clustering_coef", studentsCC)
[OUT] Hobbies Set Average clustering coef: 0.22281207580527304
[OUT] Students Set Average clustering coef: 0.2835077488648917

```

Ploting the network

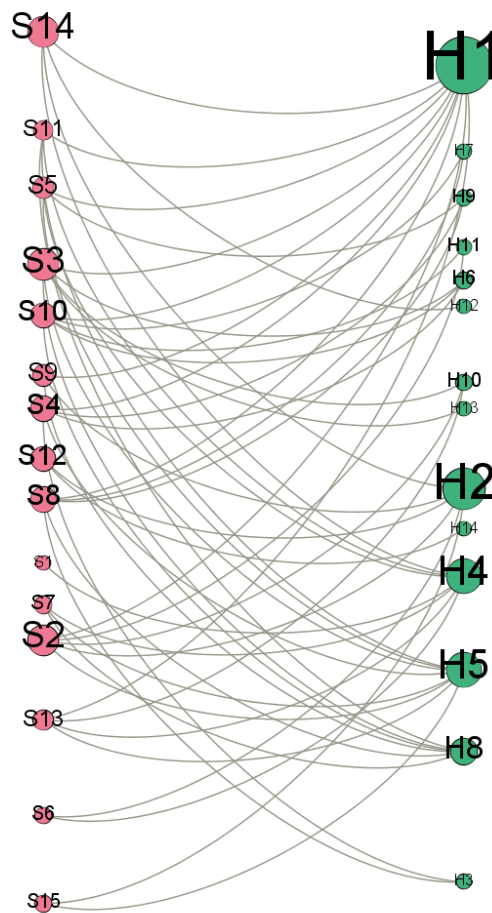


Figure 1: Graph plotted with Gephi