

## Scale-free networks and models, graphs vs networks

You are given three networks in Pajek format (edge list and LNA formats are also available).

- The famous [Zachary karate club network](#) (small)
- [iMDB actors collaboration network](#) (medium)
- A part of [Google web graph](#) (large)

### I. Barabási-Albert and Price scale-free graphs

1. **(answer)** Study the following two algorithms for generating Barabási-Albert scale-free graphs  $G(n, c)$  and Price scale-free graphs  $G(n, c, a)$  using relation  $\frac{q+a}{n(c+a)} = \frac{c}{c+a} \frac{q}{nc} + \frac{a}{c+a} \frac{1}{n}$ . What is the main difference between the algorithms? What is the time complexity of the algorithms?

<pre>input  nodes <math>n</math>, degree <math>c</math> output <i>undirected scale-free</i> <math>G</math> 1: <math>Q \leftarrow</math> empty queue 2: <math>G \leftarrow</math> empty graph 3: <b>while not</b> <math>G</math> has <math>n</math> nodes <b>do</b> 4:   <math>i \leftarrow</math> add node to <math>G</math> 5:   <b>for</b> <math>c</math> times <b>do</b> 6:     <math>Q.add(i)</math> 7:     <math>Q.add(j \leftarrow Q.random())</math> 8:     add link between <math>i</math> and <math>j</math> 9: <b>return</b> <math>G</math></pre>	<pre>input  nodes <math>n</math>, out-degree <math>c</math>, free <math>a</math> output <i>directed scale-free</i> <math>G</math> 1: <math>Q \leftarrow</math> empty queue 2: <math>G \leftarrow c</math> isolated nodes 3: <b>while not</b> <math>G</math> has <math>n</math> nodes <b>do</b> 4:   <math>i \leftarrow</math> add node to <math>G</math> 5:   <b>for</b> <math>c</math> times <b>do</b> 6:     <b>if</b> <math>[0, 1).random() &lt; c/(c + a)</math> <b>then</b> 7:       <math>Q.add(j \leftarrow Q.random())</math> 8:     <b>else</b> 9:       <math>Q.add(j \leftarrow \{0, \dots, i\}.random())</math> 10:    add link from <math>i</math> to <math>j</math> 11: <b>return</b> <math>G</math></pre>
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2. **(code)** Implement both algorithms and generate Barabási-Albert and Price scale-free graphs corresponding to larger networks above. Plot their degree distribution  $p_k$  and compute power-law exponents  $\gamma$  of seemingly scale-free distributions using maximum likelihood formula below. Are the results expected or are they surprising?

$$\gamma = 1 + \bar{n} \left[ \sum_{i=1}^n \ln \frac{k_i}{k_{min} - \frac{1}{2}} \delta(k_i \geq k_{min}) \right]^{-1}$$

### II. Synthetic random graphs vs real networks

Consider different large-scale properties of real networks. Namely, low average node degree  $\langle k \rangle \ll n$ , one giant connected component  $S \approx 1$ , short distances between the nodes  $\langle d \rangle \approx \frac{\ln n}{\ln \langle k \rangle}$ , high average node

clustering coefficient  $\langle C \rangle \gg 0$ , power-law degree distribution  $p_k \sim k^{-\gamma}$ , pronounced community structure etc.

1. **(answer)** Design synthetic graph model that generates undirected graphs that are *most different* from real networks.
2. **(code)** Implement generative graph model that *well reproduces* the structure of real undirected networks.
3. **(answer)** Does your model have reasonable interpretation or explanation? Does it also reproduce the structure of real directed networks?