

Advanced network algorithms, random graph models

You are given four networks in Pajek format.

- Tiny toy network for testing (toy.net)
- Zachary karate club network (karate_club.net)
- iMDB actors collaboration network (collaboration_imdb.net)
- A small part of Google web graph (www_google.net)

I. Average node distance and network diameter

1. **(discuss)** Study the following algorithm for computing the distances between the nodes $\{d\}$ by level order link traversal. Does the algorithm implement breadth-first or depth-first search? Why? What is the time complexity of the algorithm?

```
input  graph G
output network distances {D}
1: {D} ← empty list
2: for nodes  $i \in N$  do
3:   {D}.add(distances(G, i))
4: return {D}
```

```
input  graph G, node i
output directed distances D
5: ...
6: for successors  $j \in \Gamma_i^{out}$  do
7:   ...
```

```
input  graph G, node i
output undirected distances D
1: D ← empty array
2: Q ← empty queue
3: D[Q.add(i)] ← 0
4: while not Q empty do
5:   i ← Q.remove()
6:   for neighbors  $j \in \Gamma_i$  do
7:     if D[j] undefined then
8:       D[j] ← D[i] + 1
9:       Q.add(j)
10: return D
```

2. **(code)** Implement the algorithm and compute the average distance between the nodes $\langle d \rangle$ and the maximum distance or diameter d_{\max} of *smaller* networks. Are the results expected?
3. **(discuss)** How is the algorithm different from the famous Dijkstra algorithm? In which case you would have to use the Dijkstra algorithm?
4. **(discuss)** How could you speed up the algorithm to *only* approximate $\langle d \rangle$ and d_{\max} ?

II. Average node clustering coefficient

1. **(discuss)** Study the following algorithm for computing the node clustering coefficients $\{C\}$ by link triad

counting. Why does the algorithm count triads over the links and not over the nodes? What is the time complexity of the algorithm?

```

input  graph  $G$ 
output average clustering  $\langle C \rangle$ 
1:  $\langle C \rangle \leftarrow 0$ 
2: for nodes  $i \in N$  do
3:    $\langle C \rangle \leftarrow \text{clustering}(G, i)/n$ 
4: return  $\langle C \rangle$ 

```

```

input  graph  $G$ , node  $i$ 
output node clustering  $C$ 
1: if  $k_i \leq 1$  then
2:   return 0
3: return  $\text{triads}(G, i) \cdot 2 / (k_i^2 - k_i)$ 

```

```

input  graph  $G$ , node  $i$ 
output node triads  $t$ 
1:  $t \leftarrow 0$ 
2: for neighbors  $j \in \Gamma_i$  do
3:   if  $|\Gamma_i| \leq |\Gamma_j|$  then
4:      $t \leftarrow t + \text{triads}(G, i, j)/2$ 
5:   else
6:      $t \leftarrow t + \text{triads}(G, j, i)/2$ 
7: return  $t$ 

```

```

input  graph  $G$ , link  $i, j$ 
output link triads  $t$ 
1:  $t \leftarrow 0$ 
2: for neighbors  $k \in \Gamma_i$  do
3:   if  $k \in \Gamma_j$  then
4:      $t \leftarrow t + 1$ 
5: return  $t$ 

```

2. **(homework)** Implement the algorithm and compute the average node clustering coefficient $\langle C \rangle$ of all four networks. Are the results expected?
3. **(discuss)** What kind of network representation is required by the algorithm?

III. Erdős-Rényi random graphs and link indexing

1. **(discuss)** Study the following two algorithms for generating Erdős-Rényi random graphs $G(n, m)$ with and without link indexing $\binom{i}{2} + j, i > j$. What is the main difference between the algorithms? What is the time complexity of the algorithms?

```

input  nodes  $n$ , links  $m$ 
output simple random  $G$ 
1:  $H \leftarrow$  empty set
2:  $G \leftarrow n$  isolated nodes
3: while not  $G$  has  $m$  links do
4:    $h \leftarrow \{0, \dots, (n^2 - n)/2 - 1\}.\text{random}()$ 
5:   if  $H.\text{add}(h)$  then
6:      $i \leftarrow 1 + \lfloor -0.5 + \sqrt{0.25 + 2h} \rfloor$ 
7:     add link between  $i$  and  $h - (i^2 - i)/2$ 
8: return  $G$ 

```

```

input  nodes  $n$ , links  $m$ 
output random multi  $G$ 
1:  $G \leftarrow n$  isolated nodes
2: while not  $G$  has  $m$  links do
3:    $i, j \leftarrow \{0, \dots, n - 1\}.\text{random}()$ 
4:   if  $i \neq j$  then
5:     add link between  $i$  and  $j$ 
6: return  $G$ 

```

2. **(code)** Implement one of the algorithms and generate Erdős-Rényi random graphs corresponding to all four networks, and compute their S , $\langle d \rangle$ and $\langle C \rangle$. Are the results expected?

IV. Configuration model graphs and link rewiring

1. **(discuss)** Study the following two algorithms for generating configuration model graphs $G(\{k\})$ with either link rewiring or stub matching. What is the main difference between the algorithms? What is the time complexity of the algorithms?

input simple links L

output *configuration simple* G

```

1:  $H \leftarrow$  empty set
2: for links  $\{i, j\} \in L$  do
3:    $H.add(h_{ij})$ 
4: while not links  $L$  rewired do
5:    $\{i, j\}, \{s, t\} \leftarrow L.random()$   $\triangleright$  removes links
6:   if  $H.contains(h_{it} \text{ or } h_{sj})$  or  $i = t$  or  $s = j$  then
7:      $L.add(\{i, j\})$ 
8:      $L.add(\{s, t\})$ 
9:   else
10:     $L.add(\{i, t\})$   $H.add(h_{it})$   $H.remove(h_{ij})$ 
11:     $L.add(\{s, j\})$   $H.add(h_{sj})$   $H.remove(h_{st})$ 
12: return  $G$  on links  $L$ 

```

input nodes n , degrees $\{k\}$

output *configuration pseudo* G

```

1:  $Q \leftarrow$  empty queue
2:  $G \leftarrow n$  isolated nodes
3: for nodes  $i \in N$  do
4:   for  $k_i$  times do
5:      $Q.add(i)$ 
6: while not  $Q$  empty do
7:    $i, j \leftarrow Q.random()$   $\triangleright$  removes nodes
8:   add link between  $i$  and  $j$ 
9: return  $G$ 

```

2. **(code)** Implement one of the algorithms and generate configuration model graphs corresponding to all four networks, and compute their S , $\langle d \rangle$ and $\langle C \rangle$. Are the results expected?

