

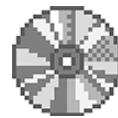
Models of formation  
preferential attachment  
Barabasi-Albert  
Local-Attachment  
Vertex-copying  
Small World  
Regular networks

SYSM 6302

CLASS 11

# Barabasi-Albert Model

BA( $n, q$ )



Initialization: start with a clique of  $q$  nodes ( $\frac{q(q-1)}{2}$  edges)

At each "time" step: add a new node  $V_t$  with  $q$  connections made to existing nodes.

Edge between  $V_t$  and  $V_i$  with probability  $\frac{k_i}{\sum_{j=1}^{t-1} k_j}$

a node with 3 times the degree of another is 3 times more likely to receive an edge

$$\left. \begin{aligned} n &= q + t \\ m &= \frac{q(q-1)}{2} + qt \end{aligned} \right\} c = \frac{2m}{n} \sim 2q \quad (\text{for large enough } t)$$

↑ Preferential Attachment  
"the rich get richer"

⇒ Preferential attachment is a model of network formation that leads to scale-free degree behavior.

$$P_k \sim k^{-\alpha}, \quad \alpha = 3$$

# BA properties



Avg. shortest path:  $l = \frac{\ln(n)}{\ln(\ln(n))}$

(slightly) shorter average shortest path than ER model

Clustering Coefficient:  $C = \frac{[\ln(n)]^2}{n}$

decreases with  $n \rightarrow \infty$

Directed version: typically  $\text{new} \longrightarrow \text{old}$

Extensions: nonlinear preferential attachment  
preferential attachment based not on degree

# Local Attachment $LA(n, q, q_r)$ , $q_r \leq q$ Inherently directed



Initialization: start with a clique of  $q+1$  nodes

At each "time" step: ① Add  $q_r$  edges randomly with uniform probability

② Add  $q - q_r$  edges randomly (uniformly) to the out bound neighbors of the nodes connected to in ①

$p_k \sim k^{-r-2}$  ,  $r = \frac{q_r}{q - q_r} \Rightarrow$  Local attachment is also a mechanism that leads to scale free degree distribution

$\rightarrow$  Can exhibit high clustering

$\rightarrow$  diameter  $d \sim \frac{\ln(n)}{\ln(\ln(n))}$

# Vertex-Copying

(Duplication-Divergence Model)

DD( $n, p$ )



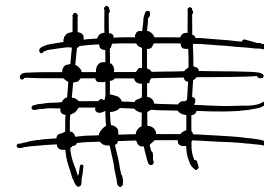
Initialization: Begin with two connected nodes

At each "time" step: ① Randomly (uniformly) select a node and duplicate it

② Retain the original edges with probability  $p$   
(if no edges are retained, discard & redo)

Vertex-copying is another (biologically-inspired) model that can generate scale free degree distributions.

Regular Networks: all nodes have the same degree



+ Random Networks

## Small World Networks

$SW(n, q, p)$ ,  $q$  must be even

- ① place nodes in a ring and connect each node to  $\frac{q}{2}$  nodes to its "left" & "right".
- ② randomly (uniformly) connect nodes with probability  $p$

Combines clustering (regular networks) with short average paths (random graphs)

$$\text{clustering } C = \frac{3(q-2)}{4(q-1)} \rightarrow \frac{3}{4} \text{ as } q \rightarrow \infty$$