

# Network Science

Lecture-1

30.09.24

Textbook- Network Science (Barabasi) Chapter 0 - Personal introduction

\* degree, degree distribution

classification by degree distribution

Paul Erdos?

\* Network behind student movement

## Introduction

\* If we can explain the props of a system by the component's prop

then this is not a complex system.

\* A complex system does something beyond the union of the component.

\* Universality of network characteristics

- does not depend on the source of the network
- properties independent of domain

- Analysis is domain independent

- Solution can be extended to specific domain

## Chans of Network Science

- interdisciplinary
- Empirical, data driven
- Quantitative and mathematical

### Computational:

— o —

Dense Subgraph → each a suspected group

### Management:

7 October 2024

Lecture - 2

### Graph Theory for Network Science:

\* Some mismatch in notation between graph theory and net. science

\* Konigsberga

\* Euler's proof is the birth of network/graph theory

\* degree of all vertex has to be even

- \* This is because if I enter a city through a path, then I have to take another path to leave.
- \* Euler's only proved necessity.
- \* Sufficiency is proved much later
- \* Eulerian graph

### Network and Graphs

nodes, vertices  $N$

links, edges  $L$

network, graph  $(N, L)$

- \* refer to real system as network
- \* ~ ~ underlying math as graph.

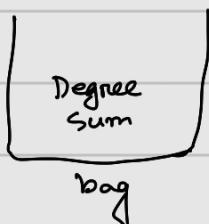
### A common language

Degree:  $k_A$        $\frac{k_B^{\text{in}}}{\text{undir}}$        $k_B^{\text{out}}$        $\uparrow$  Dir.

Degree Sum Formula:  $\sum_{v \in V} \deg(v) = 2m$ ;  $m \rightarrow \# \text{edges}$

Applicable to simple  
and multigraph

proof:



each edge contributes 2 in the bag.

multigraph  $\rightarrow$  multiedge or loop present (self)

Degree Sequence: List of vertex degrees. Nonincreasing order

exa: 5, 4, 3, 3, 3, 2

Degree Set: distinct degrees in degree sequence

exa: {5, 4, 3, 2}

Degree Seq: Necessary and sufficient condn

sum  $\leftrightarrow$  even

\* # odd degree is even.

To construct a graph from seq:

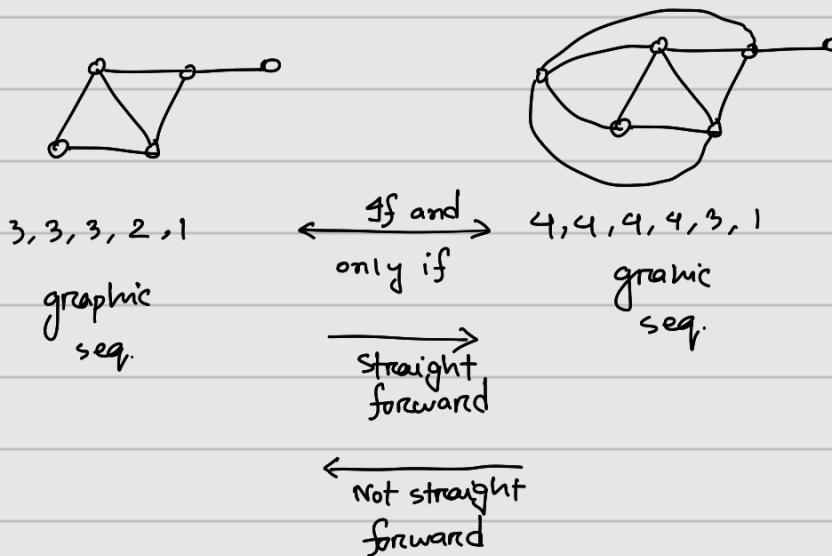
pair up the odd degrees. add edge between pairs. Then add self loops.

\* Graphic Sequence: Degree Sequence of simple graph

\* 2, 2, 0 not a graphic sequence

\* Is given a sequence Graphic Sequence? ← This type of problems are called realizability problem

hakemi - 1962 hekel - . . .



Degree Distribution :  $p(k)$  : probability that a randomly chosen node has degree  $k$ .

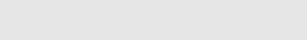
Subgraphs:  $G = (V, E)$   $G' = (V', E')$

if  $V' \subseteq V$ ,  $E' \subseteq E$  then  $G'$  is a subgraph of  $G$ .

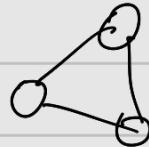
Vertex induced subgraph: particular subset of vertex and all the edges between them.

Edge induced subgraph: Similar

Singleton :



Triad:



Dyad :



Clique: a subgraph which is a complete graph

Complete Graph:  $0 k_1$   $0 - o k_2$



Clusters: Subgraph which is not a clique but very dense.

Egocentric Network : Degree-1 network

$\sim - 1.5 \sim$

\* a particular vertex, and their neighbors forming a subgraph  $\rightarrow$  Degree-1

\* add edges between the neighbors to the graph  $\rightarrow$  Degree 1.5 network.

\* Clustering Coefficient : edges between neighbors / total possible edge between them.

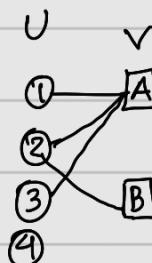
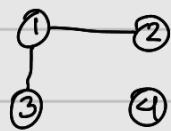
\* Neighbor's neighbors  $\rightarrow$  Degree-2 ??

Digraph  $\rightarrow$  directed graph

Graph Representation :

Bipartite Networks :

Projection U



Pathology :

walk :  $w = v_0, e_1, \dots, v_{f-1}, e_f, v_f$  Can visit any edge/vertex multiple times

Trail : edge cannot be repeated

→ end vertices same  
then cycle.

Path : vertex cannot be repeated (except end vertices)

↓  
edges cannot be repeated

$$A = \begin{pmatrix} a & b & c & d \\ a & 0 & 1 & 0 & 0 \\ b & 1 & 0 & 1 & 1 \\ c & 0 & 1 & 0 & 1 \\ d & 0 & 1 & 1 & 0 \end{pmatrix} = A$$

$$A^2 = \begin{pmatrix} 0 & 1 & 0 & 0 \\ 1 & 0 & 1 & 1 \\ 0 & 1 & 0 & 1 \\ 0 & 1 & 1 & 0 \end{pmatrix} \times \begin{pmatrix} 0 & 1 & 0 & 0 \\ 1 & 0 & 1 & 1 \\ 0 & 1 & 0 & 1 \\ 0 & 1 & 1 & 0 \end{pmatrix}$$

$A^2 \rightarrow$  entries indicate how many walks of length 2

Connected Graphs:

Connected Components: maximal connected subgraph.

Circuit: closed trail

Eulerian trail: trail that has every edge exactly once.

Eulerian Circuit:

Constructive proof for sufficiency

Diameter

Diameter: max among all pairwise shortest distance  
(of a graph)

Eccentricity

Radius:

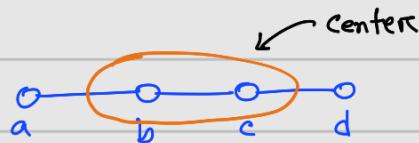
(of a graph)

Eccentricity: max of  
distance of all other vertex from  
(of a vertex) it

Center

diameter: max of eccentricity  
(of a graph) radius: min of

(of a graph) center: vertex induced subgraphs by the  
nodes with minimum eccentricity



For any tree, center is either a single vertex or an edge

Finding Tree center algos: recursively delete leaf until left with a  
vertex or edge

Centrality: is a measure of determining which nodes are most influential.

Depending on application, various ways to define centrality.

Degree Centrality: centrality = degree

Closeness Centrality: avg  
(shortest path length to all other nodes)

center = node with minimum

Betweenness Centrality: Can be measured for both vertex and edge.

Take all pairwise shortest path. count how many times a node/edge appears in the shortest paths.

If between two nodes multiple path are shortest, then include all.

### Eigen vector centrality:

importance depends on neighbor's importance.

— x — centrality — x —

### Average path length/distance:

Hamiltonian Path: a path in  $G_i$  that includes every nodes in  $G_i$ .

If the path is cycle, then it's called Hamiltonian Cycle

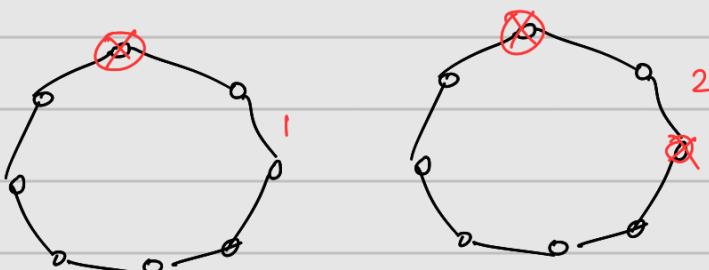
and the graph is called Hamiltonian Graph.

necessary condition: ① Connected ② Cycle presents . . . -

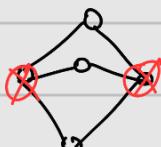
another ~ " ?

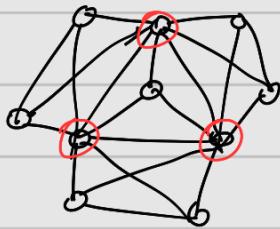
For each subset  $S$ , the number of connected components in  $G-S$  is at most  $|G|$ .

This is true for any cycle.

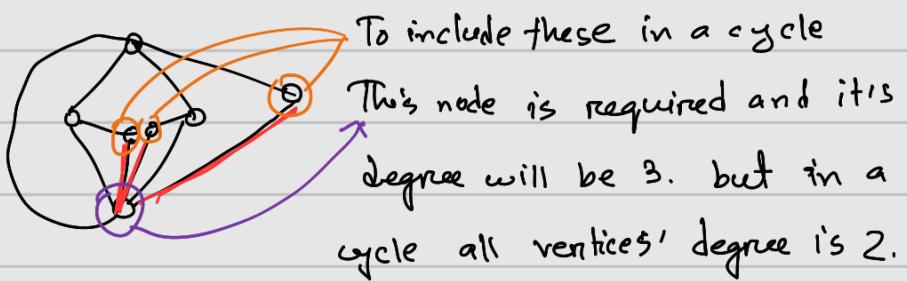


graph b in slide not Hamiltonian





do not form Expl:



Ore's Theorem → sufficient condition

(undirected)  
Connected Graph:  
connected vs adjacent

Component: maximal connected subgraph

Strongly and weakly connected:  
(Directed)  
weakly → connected after removing direction  
strongly →  $\sim$  with directed edge.

(K)

Connectivity: min #vertices to make the graph disconnected on a single vertex graph  $K_1$ .

$K_n \rightarrow$  Complete graph

$K_4 \rightarrow$  longest  $K_n$  that can be drawn without  
edge crossing.

k-Connected: connectivity  $> k$

Separating Set / Vertex cut: set of vertex to remove to make it disconnecte

Edge Connectivity: min #edge to make it disconnected ( $\kappa'$ )

$k$ -edge-Connected:

$\delta(G) \rightarrow$  minimum degree

$$\alpha(G) \leq \alpha'(G) \leq \delta(G)$$

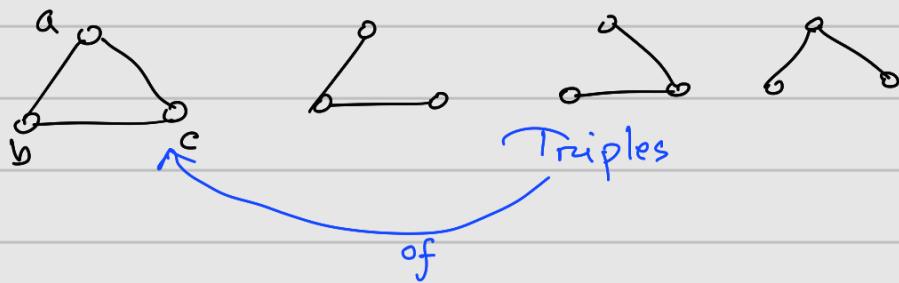
Block-Cutvertex Tree:

Clustering Coefficient: (of a node)

$$C_i = \frac{e_i}{\frac{k_i(k_i-1)}{2}}$$

??  
# possible edges among neighbors

Global clustering Coefficient:



Triple is very important in Social Science.

This is called forbidden structure.

Complex Network Conference

## Random Network Model

Real world net এর mathematical model create কৰতা চাহো।

Fractal Geometry

Erdos number

Erdos - Renyi

$G(N, p)$  model ব্যৱহাৰ study কৰা আছে।

→ #links is variable

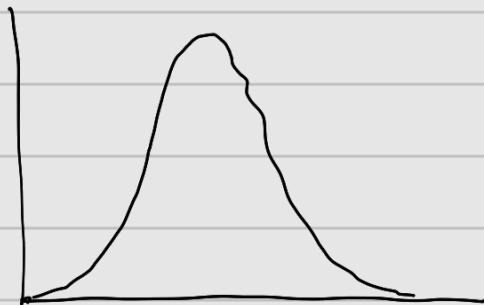
$p(L)$ : The prob to have exactly  $L$  links

$$p(L) = \binom{\frac{N(N-1)}{2}}{L} p^L (1-p)^{\frac{N(N-1)}{2}-L}$$

Binomial Distribution

## Degree Distribution

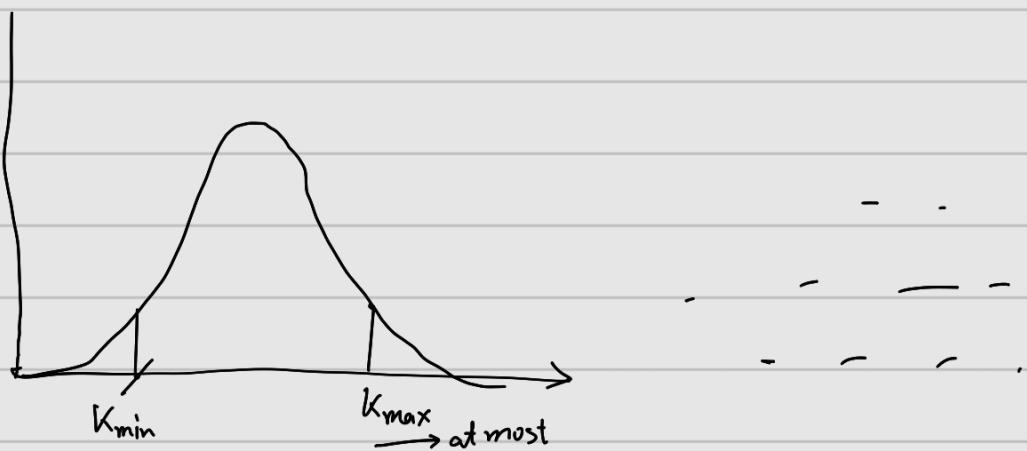
$p(k) \rightarrow$  prob. that a randomly chosen node has degree  $k$ .



$$p(k) = \binom{N-1}{k} p^k (1-p)^{N-1-k}$$

poisson distr কৃষি degree এৰ উপয় depend কৰিছো।

Real Networks are not Poisson



$$\langle k \rangle = 1000 \quad N = 10^9$$

$k_{\max} = 1185$     $k_{\min} = 816$ ; not realistic



The evolution of a random Network

Rafi Vai (boss of random netw)  
case closed



me

Shuaib Vai Zinda bad