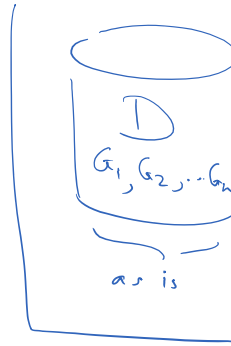
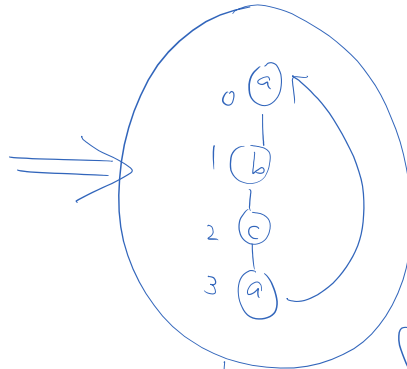
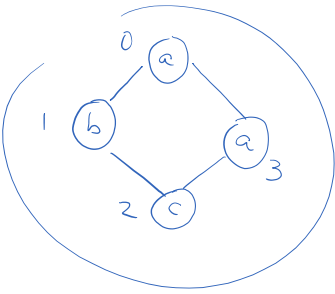
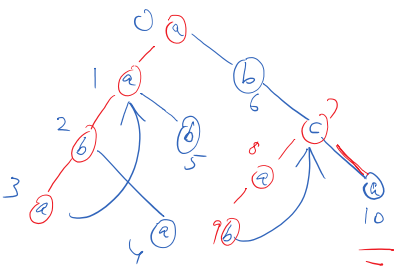


DFS code



all patterns should be kept in min DFS code format



DFS code

0 1	a b	-
1 2	b c	-
2 3	c a	-
3 0	a a	-

0 1 a a -
 1 2 a b -
 2 3 b a -
 3 1 a a -
 2 4 b a -
 1 5 a b -
 0 6 a b -
 5 7 b c -
 7 8 c a -
 8 9 a b -
 9 7 b c -
 7 10 c a -

RMP: right most path (Pre-order tree traversal)

[0 1 2 3 4 5 6 7 8 9 10] N-L-R

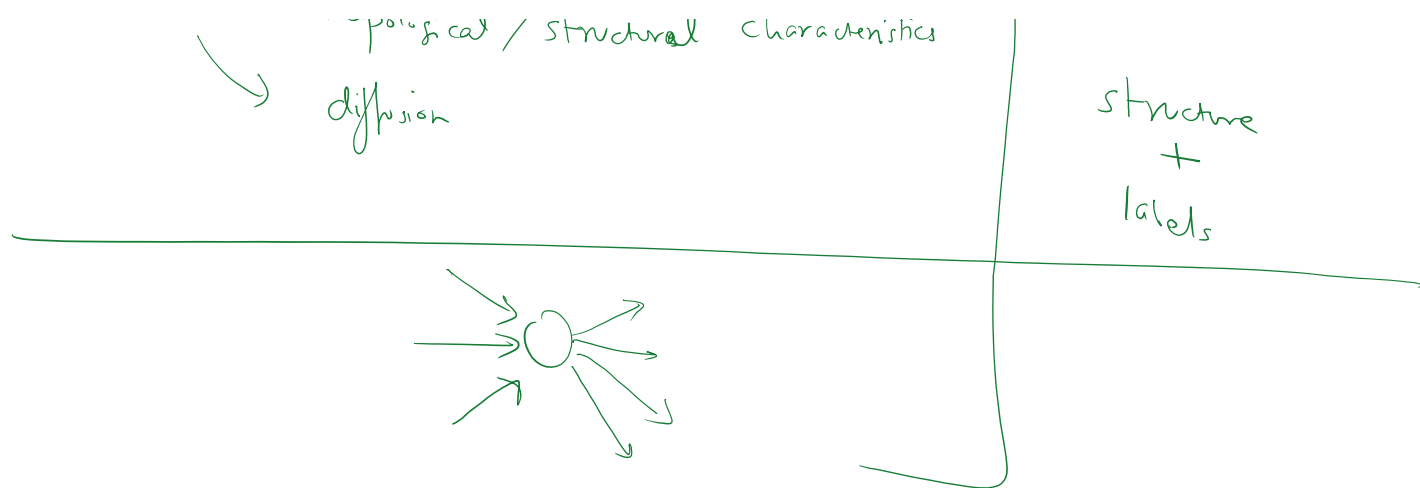
0-6-7-10

see lecture246.pdf

graph analysis

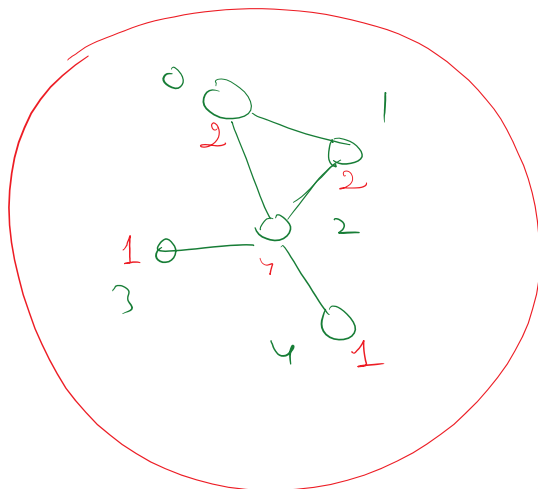
- graph pattern mining
- topological / structural characteristics
- diffusion

struct



Power-law (degree distributions)

N_i : # of nodes with degree i



N_0, N_1, N_2, N_3, N_4

0 2 2 0 1 ← degree sequence frequency

degree distribution

$$f(k) = P(\text{degree } k) = \frac{N_k}{N}$$

$$f(k) \propto k^{-\gamma}$$

γ is constant

← degree distributions of real-world networks tend to be power-laws

$$f(k) = c \cdot k^{-\gamma}$$

↑
proportionality constant

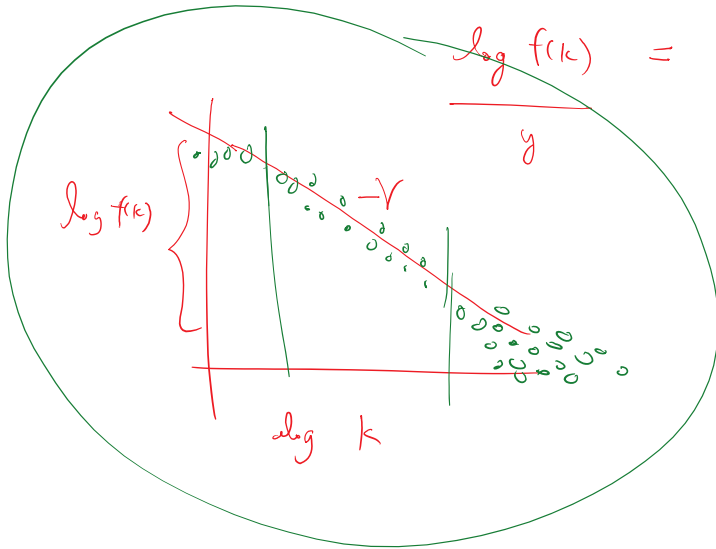
proportionality constant

$$\log f(k) = \log (c \cdot k^{-\gamma})$$

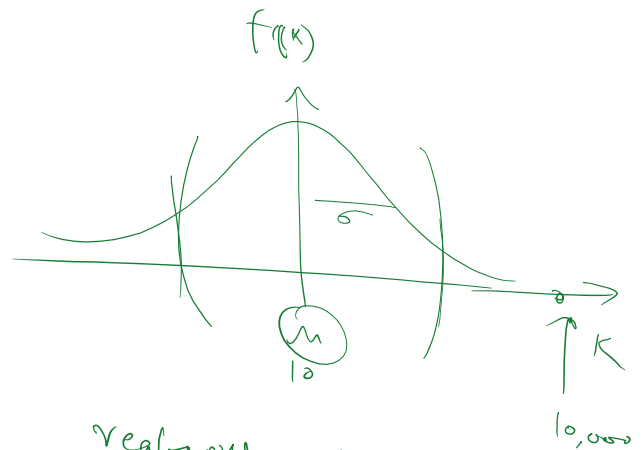
$$= \log(c) + \log(k^{-\gamma})$$

$$\log f(k) = \frac{\log(c)}{b} - \gamma \frac{\log k}{x}$$

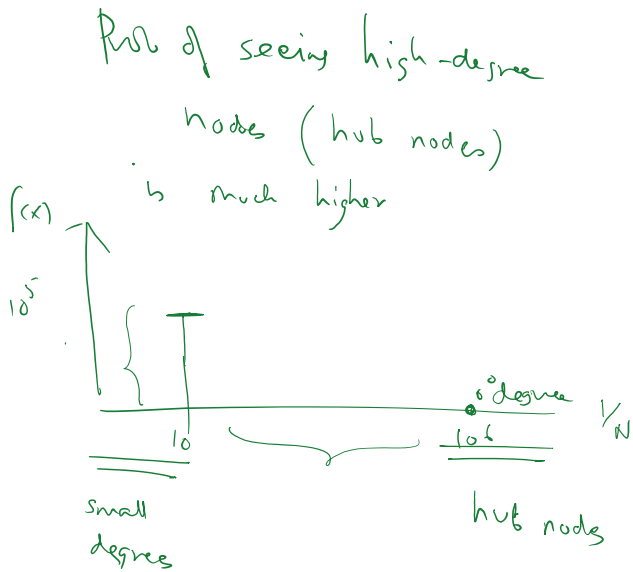
slope



power-law / scale-free network



real-world graphs are far from normal



$$\mu = \frac{10 \cdot 10^5 + 3 \cdot 10^6}{10^5} =$$

mean degree does not convey much information

Path-lengths

Given "Undirected" graph G

$$\underbrace{d(x,y)}_{\text{distance}} = \underbrace{\text{length of the shortest path from } x \text{ to } y}_{\# \text{ of hops}}$$

$$\mu_{\text{dis}} = \frac{\sum_x \sum_{y > x} d(x,y)}{\underbrace{\binom{n}{2}}}$$

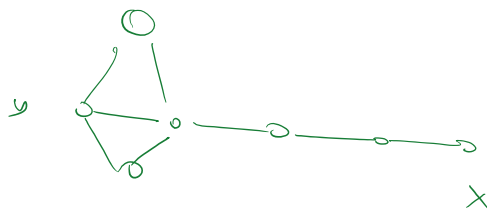
$$\binom{n}{2} = \frac{n \cdot (n-1)}{2}$$

assuming G is connected

$d(x,y) = \infty$ if there is no path between x & y

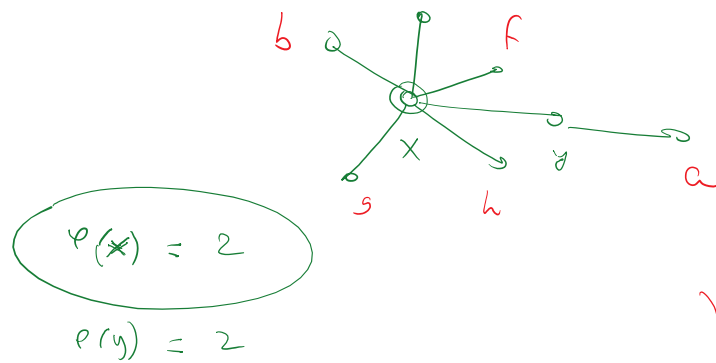
Eccentricity of vertex n

$$e(x) = \max_y \{ d(x,y) \}$$



Radius (G) :

$$\min_x \left\{ \max_y \{ d(x,y) \} \right\}$$



x, y are called "center" nodes

$$\text{diameter (G)} : \max_x \left\{ \max_y \{d(x, y)\} \right\}$$

$$= \max_{x, y} \{d(x, y)\}$$

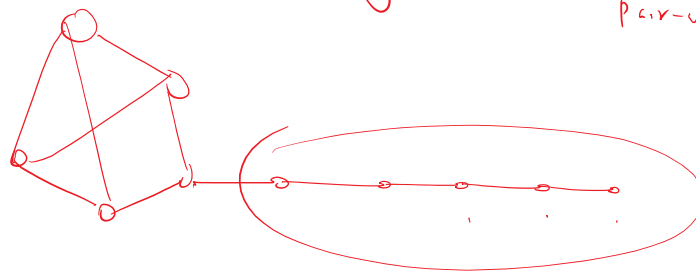
$\text{dia(G)} = 3$

Such vertices are "peripheral"

"effective" radius / diameter
↓
trimmed

90% radius
10% diameter

⇒ Remove 1-9% of the largest pair-wise distances & then compute the radius / diameter



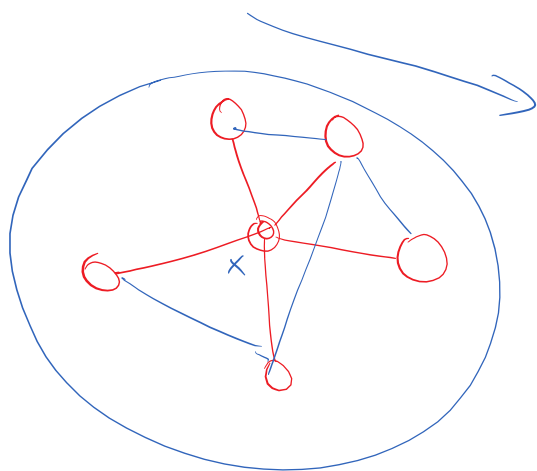
Real-world networks are "small-world"

avg path length / diameter $\propto O(\log n)$

→ also in time

→ densification in time

clustering coefficient / transitivity

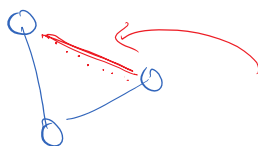


ego-network

$$\begin{aligned}
 cc(x) &= \frac{\text{\# of edges among } x\text{'s neighbors}}{\text{\# of possible edges between them}} \\
 &= \frac{4}{5C_2} \\
 &= \frac{4}{10} = 40\%
 \end{aligned}$$

$$cc(G) = \frac{1}{n} \sum_x cc(x)$$

avg. clustering coef



V-closure or triangle closure

$$\text{transitivity} = \frac{\text{\# closed triangles} \times 3}{\text{\# of } V\text{'s}}$$

real-world networks have higher clustering coefficient than purely random networks