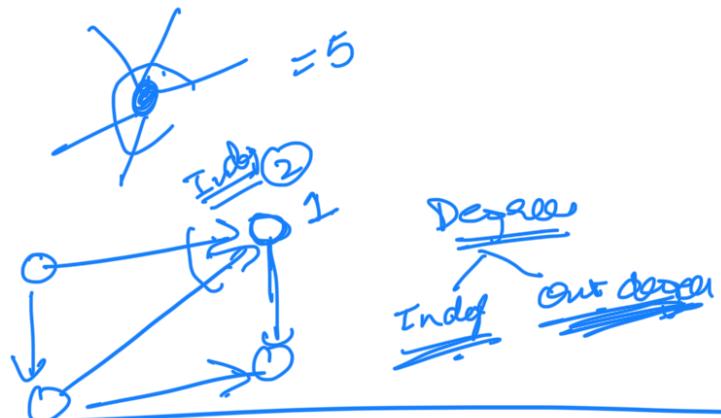


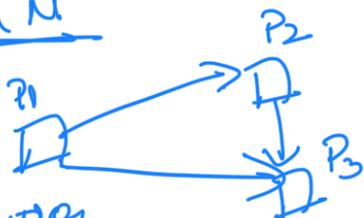
Vecture 16  
 $G(V, E)$

Degree: no. of edges incident on a node



Directed graph

citation N



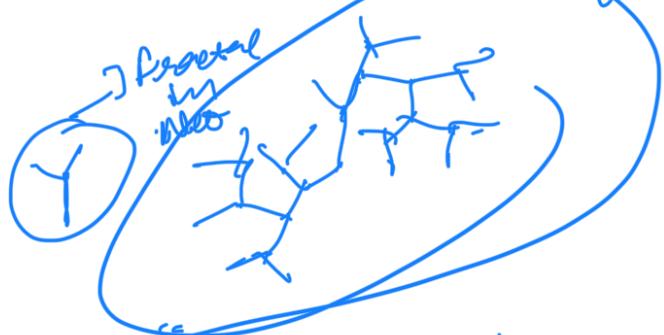
Degree Distribution

Power law

The fraction / no of nodes in the network that have degree  $k_0$ .

[The fraction decays as  $k^{-\alpha}$  for various real world network.]

P.L  $\rightarrow$  S.F  $\rightarrow$  self repeating topology



Mathematical representation of SF N

is your have function  $f(x)$  of a linear.  
Scaling is applied on the independent variable

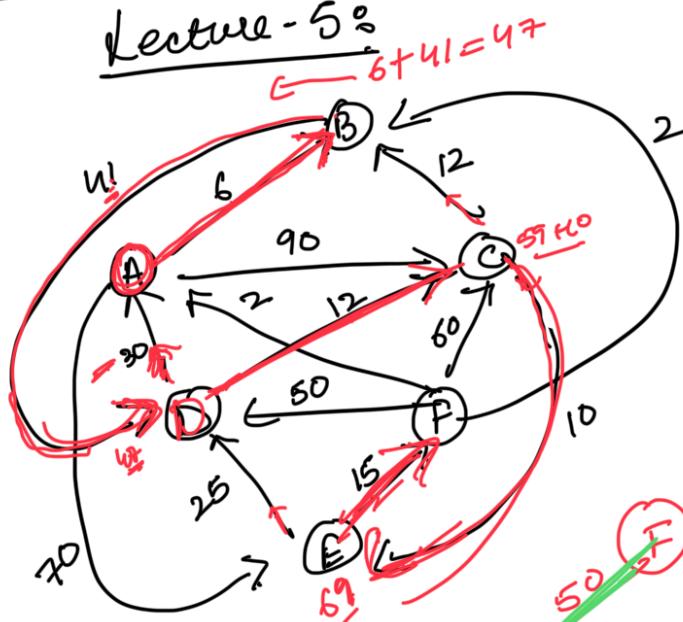
$x \rightarrow 'a'$  the function form  
does not change.

$$f(x) = A x^{-\alpha} \quad \dots \quad (1)$$

where  $A, \alpha$  are constants

$$\begin{aligned} f(ax) &= A (ax)^{-\alpha} \\ &= A a^{-\alpha} x^{-\alpha} \\ &= A' x^{-\alpha} \quad \dots \quad (2) \end{aligned}$$

### Lecture - 5<sup>o</sup>



22 A

A  
O  
N

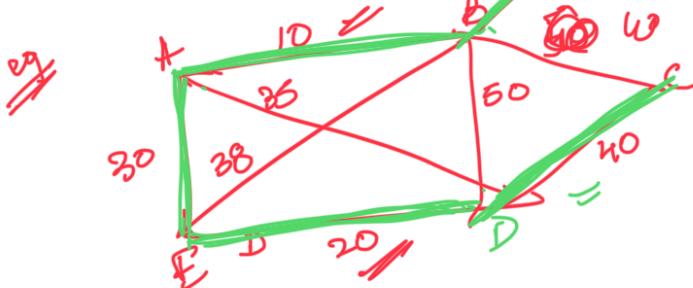
B  
α.  
N

C  
α  
N

D  
α  
N

E  
α  
N

F  
α  
N



B  
α  
N

C  
α  
N

D  
α  
N

E  
α  
N

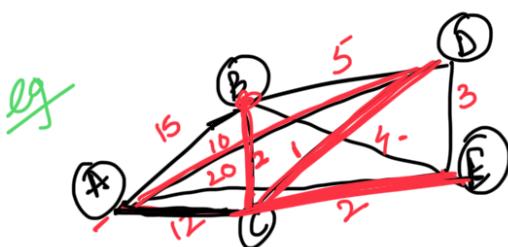
15/A  
12/A  
10/A  
20/A

A  
O  
N

D

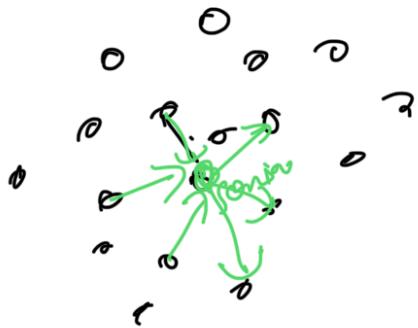
C

B



15/D  
1/D  
2/C  
3/C

## Lecture: 6

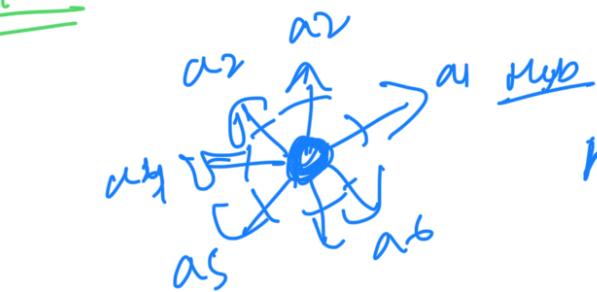


Hubs

Amt.

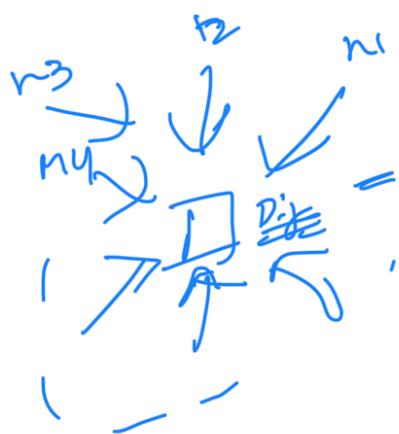
Good node will point to good node  
!

### Hub

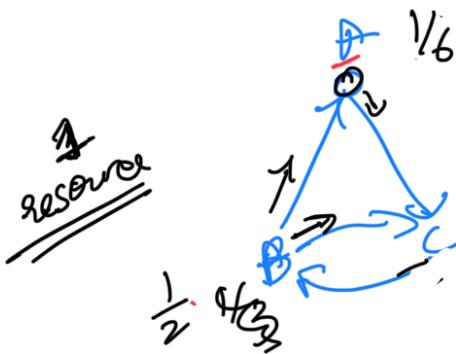


$$h = \alpha_1 + \alpha_2 + \alpha_3 + \alpha_4 - \alpha_5$$

max. freq



$$a = n_1 + n_2 - \underline{\underline{n_5}}$$



$$\frac{1}{6} + \frac{1}{2} + \frac{1}{3} = \frac{1}{3}$$

	A	B	C
I	$\frac{1}{3}$	$\frac{1}{3}$	$\frac{1}{3}$
II	$\frac{1}{6}$	$\frac{1}{3}$	$\frac{1}{2}$
III	$\frac{1}{6}$	$\frac{1}{2}$	$\frac{1}{3}$

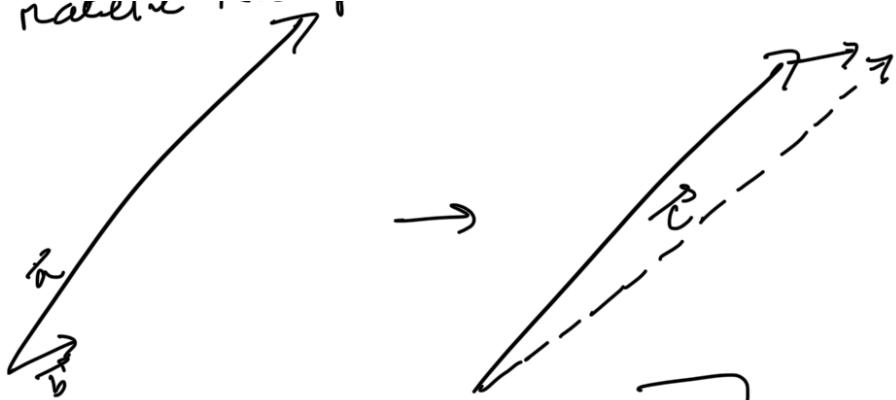
### Eigen centrality

- \* The basic idea is that the popularity of a node depends on the popularity of its neighbors which further depend on the popularity of its neighbors  $\Rightarrow$  30 one

### Recursive

... Multiplication with vector.

- \* 3 Regs: nature →
- \* 2 Regs:



- \* 3 Regs:

$$\textcircled{1} \quad A \underline{v} = \underline{\lambda v}$$

$$\textcircled{2} \quad [ ]_{2 \times 2} = 2 \text{ Independent}$$

$$\textcircled{3} \quad Z = \alpha v_1 + \beta v_2$$

$$Av = A(\alpha \underline{v}_1 + \beta \underline{v}_2)$$

Any  
vect

Set the initial popularity of node  $i = x_i^0(0)$

After 1 step.

popularity = sum of neighbours popularity

$$x_i(1) = x_i^0(0) \leq A_{ij} x_j^0(0) - \dots \quad \textcircled{1}$$

~~diff~~

$$x_i(1) = \sum_j A_{ij} x_j^0(0)$$

Let us assume that value converge at  $t$

$$x(t) = Ax(t-1)$$

$$= A A x(t-2) = A^2 x(t-2)$$

$$= A^3 x(t-3)$$

⋮

Power method  
by iteration

$$x(t) = A^t x(0)$$

- eq 2

Now let  $x_0$  be the linear combination of natural basis of matrix  $A$ .

Eigen vector of  $A$

$$x_0 = \begin{bmatrix} x_1(0) \\ x_2(0) \\ \vdots \\ x_n(0) \end{bmatrix} = c_1 \begin{bmatrix} v_1 \\ \vdots \\ v_n \end{bmatrix} + c_2 \begin{bmatrix} v_0 \\ 1 \\ \vdots \\ v_2 \end{bmatrix}$$

$$x_0 = \sum c_i v_i \quad \text{--- (3)}$$

$$\underline{x_t} = A^t \sum c_i^0 v_i^0$$

$$= \sum c_i^0 A^t v_i^0$$

$$\frac{\lambda_1}{\lambda_1} \rightarrow x_1 \quad \frac{\lambda_2}{\lambda_1} \rightarrow x_2 \quad = \sum c_i \lambda_i^t v_i^0 = \dots$$

eg

$$\begin{array}{c} 3 \\ 1 \\ 2 \end{array} \rightarrow \begin{array}{c} 2 \\ 4 \\ 8 \end{array} \quad = c_1 \lambda_1^t v_1 + \lambda_2 \sum c_2 \left( \frac{\lambda_2}{\lambda_1} \right) v_2 \approx 0$$

$$\begin{array}{c} 1 \\ 2 \\ 3 \end{array} \rightarrow \begin{array}{c} 10 \\ 2 \\ 3 \end{array} \quad x_t = \underline{c_1 \lambda_1^t v_1}$$

popularity ~~is~~ corresponds to the principle eigen vector

$$\begin{bmatrix} 1 & 1 & 1 \end{bmatrix} \approx \begin{bmatrix} v_0 \\ v_1 \\ \vdots \\ v_n \end{bmatrix} \xrightarrow{\text{Ink can not}}$$

one problem  
Directed Network.

An degree of a node can be 0.  
Then 0. popularity can be propagated  
in network.

$$N \leq A t x_j + B$$

$$x_i = \frac{w_j}{\sum_j} + b$$

$b$  = small initial value of one  
 $\alpha$  = re-adjustment constant

Page Rank

$$x_i = \alpha \sum_j A_{ij} \frac{x_j}{k_{tot}} + b$$