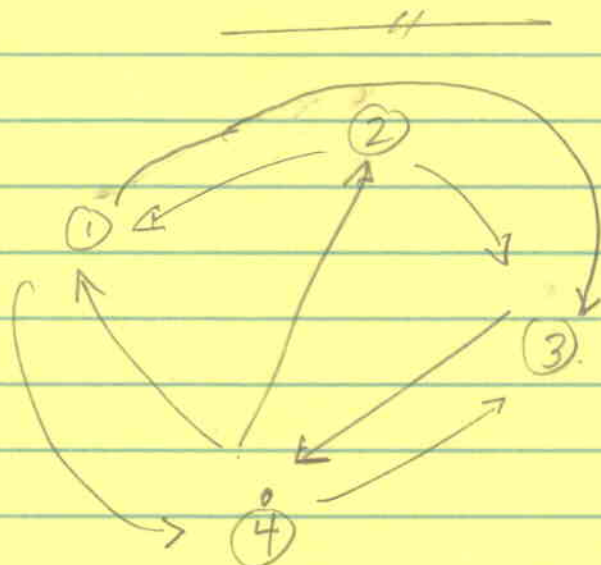
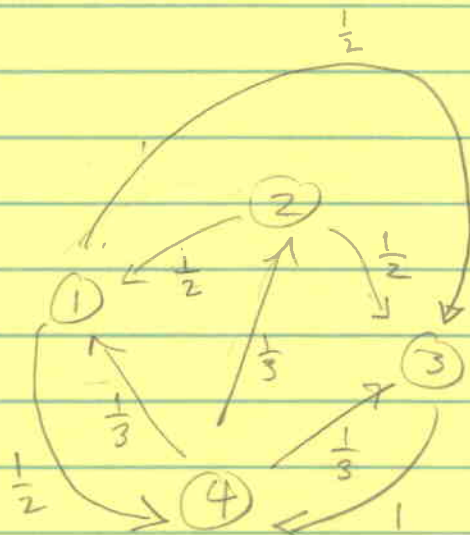


- How do we determine importance of a webpage? In the old days (BQ) text based ranking was used
BAD: a document containing the phrase "Uni High" 10^{10} times will be most important.
- Better idea: Look at how many pages point to a page.
- Better still: create a dynamical process and iterate it



Assign prob. at each page,
simply proportional to
number of links out:



Build a transition matrix

$$A \left\{ \begin{array}{c|c|c|c} 0 & \frac{1}{2} & 0 & \frac{1}{3} \\ 0 & 0 & 0 & \frac{1}{3} \\ \frac{1}{2} & \frac{1}{2} & 0 & \frac{1}{3} \\ \frac{1}{2} & 0 & 1 & 0 \end{array} \right\} \begin{pmatrix} \vec{v}(n) \end{pmatrix} = \begin{pmatrix} \vec{v}(n+1) \end{pmatrix}$$

"out" vector at ①
"out" vector at ④

So, we want to know the "equilibrium" state

$$\lim_{k \rightarrow \infty} \begin{pmatrix} a_1(k) \\ \vdots \\ a_4(k) \end{pmatrix} = \lim_{k \rightarrow \infty} A^k \begin{pmatrix} a_1(0) \\ \vdots \\ a_4(0) \end{pmatrix}$$

How do we find $A^{\text{real big}}$? Of course, by diagonalizing!

If we start w/ equal prob at all nodes,
 $\vec{v}(0) = \frac{1}{4} \begin{pmatrix} 1 \\ 1 \\ 1 \\ 1 \end{pmatrix}$, we want to know $\lim_{n \rightarrow \infty} A^n \vec{v}(0) \equiv \begin{pmatrix} .2 \\ .1 \\ .3 \\ .4 \end{pmatrix}$

But there are problems!

① The web is not a connected graph.

② You don't always follow a link on your current page; you can jump to a new page, at random!!

How in the world can we account for a random jump?

Answer: • we decide on a probability for (Page + Brin) a random jump (typically $p = .15$)

- make the random jump land on all nodes w/ equal likelihood.

$$G = (1-p)A + p \left(\frac{1}{n} \begin{bmatrix} 1 & \dots & 1 \\ \vdots & & \vdots \\ 1 & & 1 \end{bmatrix} \right)$$

↑
the Google matrix

its column gives links from node i

its col is all $\frac{1}{n}$, says there is a chance to jump to any other node in the web.

Note: G is a column stochastic matrix (for node w/ no out pointers, use $p=1$, since they must jump).

Thm (Perron-Frobenius thm).

A positive, column stochastic matrix has 1 as an eigenvalue, and the correspondingly eigenvector has all + entries

\Rightarrow There is a unique eigenvector for eigenvalue 1, whose entries sum to 1

Thm If v^* is the eigenvector above, then

$v^{(0)} = \frac{1}{n} \begin{pmatrix} 1 \\ \vdots \\ 1 \end{pmatrix}$, $G v^{(0)}$, $G^2 v^{(0)}$, ... converges to v^*

Soln : To find the Google rank, just solve

$G \vec{v} = 1 \vec{v}$, and scale so entries of \vec{v} sum to 1. ///

The resulting vector is the page rank.

Warning In fact, it is easier to just get a rough approx $G^m \cdot v^{(0)}$ by taking a small power of m .

The End.