

6	9	13	7
12		10	5
3	1	4	14
15	8	11	2

Mathematics for Computer Science  
MIT 6.042J/18.062J

# PageRank

(by Google founder  
Larry Page)



Albert R Meyer,

May 13, 2015

page-rank.1

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## Google Rankings

Which webpages are "more important?"

Model of internet:

- Users click random link on a page.
- Occasionally start over.

A page is "more important" if viewed a large fraction of time



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May 13, 2015

page-rank.2

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## Random Walk on the Web

View the entire web as digraph

- vertices are webpages
- edge  $(V,W)$  exists if link from page  $V$  to page  $W$
- edges out of  $V$  equally likely

$$\Pr[(V,W)] = 1/\text{outdeg}(V)$$



Albert R Meyer,

May 13, 2015

page-rank.3

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## Random Walk on the Web

To model *starting over*:

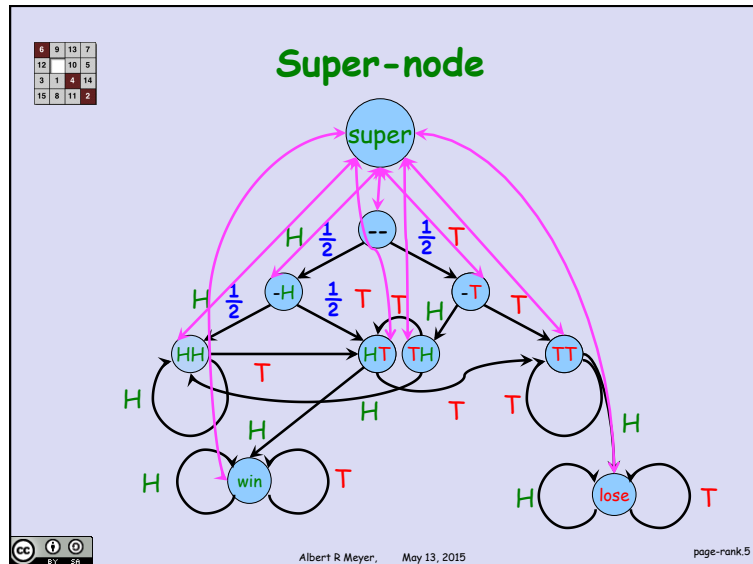
- \* add a "super-node" to the graph
- \* an edge from super-node to each other node
- \* edges from each other node back to super-node
- may get customized probabilities



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May 13, 2015

page-rank.4



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## PageRank

Compute stationary distribution  $\vec{s}$

PageRank( $V$ ) ::=  $s_V$

Rank  $V$  above  $W$  when

$s_V > s_W$

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### Resistance to scamming

- \* Creating fake nodes pointing to self
- \* Adding links to important nodes

won't improve PageRank

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### Importance of Super-node ensures

- \* **unique** stable distribution  $\vec{s}$
- \* **every** initial distribution  $\vec{p}$  converges to  $\vec{s}$

$$\lim_{t \rightarrow \infty} \vec{p} \cdot M^t = \vec{s}$$

- \* convergence is rapid:  $t$  is small so  $\vec{s}$  easy to compute

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## Actual Google Rank

Google rank rules are a closely held trade secret using text, location, payment, and other criteria that have evolved for 15 years.

But **PageRank** continues to play a significant role.

