

**Topics:** tf-idf weighting example; potential utility of link-analytic approaches; in-degree models.

**Announcements:** The office hours schedule for this week, altered because of Friday’s in-class prelim, is as follows. This information is also available at [www.cs.cornell.edu/courses/cs172/2007sp/calendar.htm](http://www.cs.cornell.edu/courses/cs172/2007sp/calendar.htm). Graded HW2’s can be picked up at the Monday and Tuesday hours as well as Wednesday’s lecture.

Monday 2/26	Tuesday 2/27	Wednesday 2/28	Thursday 3/1
			Morozov 328A Upson 9am - 10am
	Pu 328A Upson 11am - 12pm	Lee, 4152 Upson 11:15am - 12pm	Pu, 328A Upson 11am - 12pm
	Gallo 328A Upson 12pm - 1pm	Gallo 328A Upson 12:30pm - 1:30pm	Cantwell 328D Upson 12pm - 1pm
	Yeh Bay 328A Upson 1pm - 2pm		Yeh 315 Upson 1:15pm - 2:15pm
Lok 328A Upson 2pm - 2:50pm	Yatskar 328A Upson 2pm - 3pm	Lok 328A Upson 2:30pm - 3:20pm	Frongillo 328A Upson 2:15pm - 3pm
	Lee 4152 Upson 3pm - 4pm		Lee, 4152 Upson 3pm - 4pm
Morozov 328A Upson 4pm - 5pm			
Morozov (II) 328A Upson 5pm - 6pm		Yatskar 328A Upson 5:30pm - 6:30pm	Seguin 328B Upson 5:30pm - 6:30pm
Cantwell 328A Upson 6pm - 7pm			

**I. Altered example data<sup>1</sup>**  $W$ :  $w_1$ : “the”;  $w_2$ : “wolf”;  $w_3$ : “lady”;  $w_4$ : “of”;  $w_5$ : “shalott”.  
 Corpus:

$d'$ : the wolf the wolf  
 $d''$ : lady lady lady, the lady of shalott  
 $d'''$ : the the  
 $d''''$ : of the lady

Query: “the shalott painting”

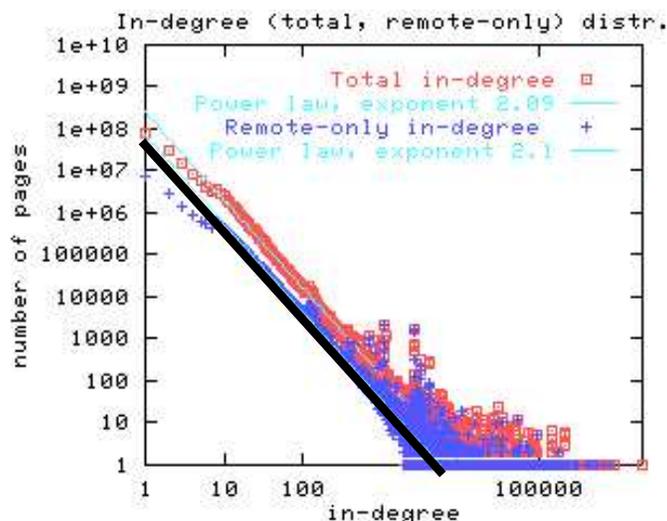
*Self-check:* Under tf weighting (and no normalization of the query vector),  $\vec{d}' \cdot \vec{q} = 2/\sqrt{8}$  and  $\vec{d}'' \cdot \vec{q} = 2/\sqrt{19}$ .

<sup>1</sup>The example provided on last lecture’s aid also shows a case where tf.idf-weighting yields a different ranking than tf weighting, but the numerical results given aren’t correct (I forgot to update all my calculations after changing the example documents a bit).

(OVER)

**II. A Web power law** A “power law” is a relationship of the form  $y = x^{-\alpha}$ , where  $\alpha$  is a constant. Observe that if we take the log of both sides, we get the linear relationship  $\log(y) = -\alpha \log(x)$ .

The *(in-)degree distribution* of a given collection of linked documents gives, for each possible in-degree  $x$ , the number (or fraction) of documents that have in-degree equal to  $x$ . Here is Figure 1 of Broder et al. (2000), which shows the in-degree distribution, on a log-log scale, for their 200M-document Web crawl. The line corresponding to  $\alpha = 2.1$  is highlighted.



**III. Web-growth models: Template, conventions and notation** We use the integer-valued variable  $t \geq 0$  to stand for time.

1. The constant  $n_0 \geq 1$  is the number of documents that exist at time  $t = 0$ ; call them  $d_{-1}, d_{-2}, \dots, d_{-n_0}$ , and assume they have no links between them.
2. At the  $j^{\text{th}}$  time step, we add a new document, named  $d_j$ ; hence, a positive subscript indicates when a document was added.
3. We then grant to  $d_j$  a constant number  $\ell$  of links, where  $1 \leq \ell$ , to some of the  $n_0 + j - 1$  pre-existing documents, allowing repeated links to the same document.
4. We are interested in computing  $\text{In}(\text{doc} = j, \text{time} = t)$ , which is our estimate of  $d_j$ 's in-degree at time  $t \geq \max(j, 1)$  (there is no point computing the in-degree of a document at a time before it existed), where  $j \geq 1$ .