Supporting Information

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SI Text

In this paper, we have two aims: (*i*) to use maximum entropy to identify a general functional form for situations involving costminus-benefit constraints, and (*ii*) to fit data over a broad range of contexts. For *i*, maximum entropy predicts an exponential of a digamma function, provided that k_0 is known; it also shows how to compute a full distribution if we are given a single quantity, $\langle w \rangle$. For *ii*, our aim is just to do simple curve-fitting of data, given the mathematical form from *i*. In this case, we have no microscopic model for k_0 , so we know neither k_0 nor μ° . In this case, our objective is not to find the full distribution from $\langle w \rangle$; rather, for *ii*, we are given the full distribution function, and our objective is to find the best values of k_0 and μ° that fit it.

Our fitting procedure is as follows. We use the maximumlikelihood estimation function mle function in MatLab, with probability distribution specified by Eq. 7. Table 1 shows estimated μ° and k_0 values, with 95% confidence intervals. We calculate goodness-of-fit *P* values using the Monte Carlo simulation procedure (based on the Kolmogorov–Smirnov test) described in ref. 1. The 13 datasets shown here are above the P = 0.05 statistical significance threshold proposed in ref. 1. *P* values shown in Table 1 are based on 1,000 simulations for each dataset.

We fit Eqs. 7 to 13 data sets:

- Project membership on the social coding Web site GitHub (downloaded from konect.uni-koblenz.de).
- 1. Clauset A, Shalizi C, Newman M (2009) Power-law distributions in empirical data. SIAM Rev 51(4):661–703.
- Boguñá M, Pastor-Satorras R, Díaz-Guilera A, Arenas A (2004) Models of social networks based on social distance attachment. *Phys Rev E Stat Nonlin Soft Matter Phys* 70(5 Pt 2):056122.
- Clauset A, Young M, Gleditsch K (2007) On the frequency of severe terrorist events. J Conflict Resolut 51(1):58–87.
- Viswanath B, Mislove A, Cha M, Gummadi K (2009) On the evolution of user interaction in Facebook. Proceedings of the Second ACM SIGCOMM Workshop on Social Networks.

- Edits made by users of the English-language Wikipedia.
- Interactions between users of the Pretty Good Privacy secure data transfer algorithm (2).
- Words occurring immediately after one another in a Spanish book (downloaded from konect.uni-koblenz.de).
- Deaths resulting from terrorist attacks from February 1968 to June 2006 (3).
- Wall posts by users to their walls on the social networking Web site Facebook, from a 2009 crawl of New Orleans Facebook (4).
- Pairwise, physical protein-protein interactions (PPI) of proteins detected in small-scale PPI network data, in yeast (*Saccharomyces cerevisiae*), fruit flies (*Drosophila melanogaster*), and humans (*Homo sapiens*) (5).
- Replies between users of the social news Web site Digg (6).
- Friendships between users of the Petster social networking site Hamsterster (downloaded from konect.uni-koblenz.de).
- Occurrences of unique words in the novel Moby Dick (7).
- Class-class dependencies in the software libraries JUNG and javax (downloaded from konect.uni-koblenz.de).

An overlay of all fits and datasets is shown in Fig. 3. Individual parameters and fits are shown in Table 1 and Fig. 2. A scatterplot of our maximum-likelihood estimates of μ° and $1/k_0$ is shown in Fig. S1.

Available at http://conferences.sigcomm.org/sigcomm/2009/workshops/wosn/. Accessed June 1, 2012.

- Patil A, Nakai K, Nakamura H (2011) HitPredict: A database of quality assessed proteinprotein interactions in nine species. *Nucleic Acids Res* 39(Database issue, suppl 1): D744–D749.
- Choudhury MD, Sundaram H, John A, Seligmann DD (2009) Social synchrony: Predicting mimicry of user actions in online social media. Proc IEEE CSE'09, 10.1109/CSE.2009.439.
- 7. Newman M (2005) Power laws, Pareto distributions and Zipf's law. *Contemp Phys* 46(5): 323–351.



Fig. S1. The μ° plotted against $1/k_0$ for the 13 data sets listed in Table 1. Error bars are 95% confidence intervals. Linear regression is shown as a solid line, $\mu^{\circ} = 0.516k_0^{-1} - 0.125$ ($R^2 = 0.991$). Each point on this plot represents an empirical data set.