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## Practical paper

# Linking social systems failure of marriages and firms: A short note

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### ABSTRACT

This study investigates the failure of social systems and tries to find a plausible mechanism. We observe stretched exponential distributions for failure of marriages in the U.S., UK, and Germany and extend evidence for power laws in large firms' failure in the U.S., and world-wide. Since summation of stretched exponentials leads to power laws, one can establish an underlying principle to link different types of social systems failure like marriages and firms. Moreover, we postulate the generation of these fat-tailed distributions in social systems failure can be explained by the least effort principle of Zipf and suggest to increase initial efforts at individual level through marriage counseling, or stakeholder synchronization to reduce failures.

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## Vinculando el fracaso de sistemas sociales de matrimonios y empresas: una nota breve

### RESUMEN

Este estudio investiga el fracaso de sistemas sociales e intenta encontrar un mecanismo plausible. Observamos distribuciones exponenciales estiradas para matrimonios fracasados en los Estados Unidos, Reino Unido, y Alemania y extender pruebas de las leyes de potencia en el fracaso de grandes empresas en los Estados Unidos y el resto del mundo. Como la suma de exponenciales estirados conduce a las leyes de potencia, se puede establecer un principio subyacente para vincular los diferentes tipos de los fracasos de sistemas sociales como los matrimonios y las empresas. Además, postulamos que la generación de estas distribuciones de 'cola gorda' en el fracaso de los sistemas sociales puede ser explicado por

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el principio del menor esfuerzo de Zipf y sugerir el aumento de esfuerzos iniciales en el nivel individual a través de terapia matrimonial, o sincronización de las partes interesadas para reducir fracasos.

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## Introduction

Social systems do not last forever (Costanza & Patten, 1995). Whether civilizations, firms, or marriages, their failures have enormous impact on personal and financial stability. Empirical studies have traditionally identified the factors that affect the failure of a social system. However, linking failure patterns across different types of social systems has been a subject of interest for researchers in many disciplines.

Fat-tailed distributions have been empirically observed in numerous natural and social systems, and are most often described in terms of stretched exponentials, log-normals, and power laws. In particular, stretched exponentials have been observed for city sizes (Laherrere & Sornette, 1998); whereas power laws have been identified in human sexual contacts (Liljeros, Edling, Amaral, Stanley, & Åberg, 2001), use of words in languages (Newman, 2005), entry age of marriage (Preston, 1981), as well as for firms regarding their sizes (Axtell, 2001; Gabaix, 2009; Luttmmer, 2007), growth (Stanley et al., 1996), and bankruptcy (Fujiwara, 2004; Podobnik, Horvatic, Petersen, Urošević, & Stanley, 2010). Mathematically, a quantity  $x$  follows a stretched exponential  $A \cdot \exp(-x^\beta/\tau)$  by introducing a fractional power law in the exponential function, where  $\beta$  is the stretching exponent ranging between  $0 < \beta < 1$ ,  $\tau$  and  $A$  are scaling parameters. For power laws a quantity  $y$  follows probability distributions of  $p(y) \propto y^{-\alpha}$ , where  $\alpha$  is the scaling parameter and normally lies in the range of  $1 < \alpha < 2$  for cumulative distribution functions (CDFs).

Based on revealed empirical patterns of failures for marriages and firms, our study suggests the known least effort principle (Zipf, 1949) as a plausible general mechanism to explain failure of social systems. As size of social systems depends on the number of individuals interacting (Parsons, 1951), we applied extreme case sampling (Patton, 2005) taking both the minimum number of two individuals required to build a social system (two in marriage), and a very large number of individuals (employees in a blue-chip firm). Therefore, we analyze data of more than 650,000 marriages in the U.S., UK, and Germany for the last 25 years, and about 3250 of the largest firms of the U.S. and worldwide for the last 100, 55, and 15 years. We find CDFs of failure times following stretched exponentials with  $\beta \approx 0.83$  in case of marriages and power laws with  $\alpha \approx 1.5$  for firms. Scale-free power law distributions can result from the summation of fat-tailed distributions by central limit theorem (Stumpf & Porter, 2012; Willinger, Alderson, Doyle, & Li, 2004), which implies that large social systems may fail because of their interacting individuals. Therefore, the best way to reduce the number of divorces and firm failures is to increase the initial efforts of individuals through marriage counseling, or stakeholder synchronization.

The next section presents the material and methods to support our study on failures at marriage (two individuals) level and firm (multiple individuals) level. Subsequently, the results are presented and discussed.

## Material and methods

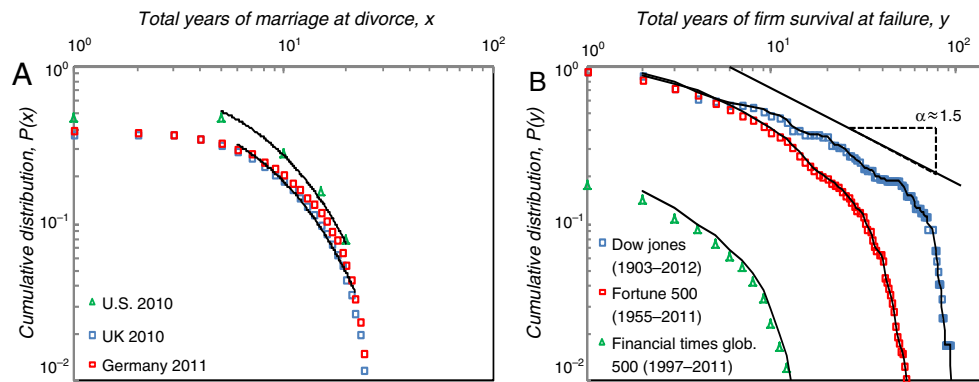
We analyzed failures of the two social systems: marriages and large firms. Marriage data is derived from panel surveys conducted in the U.S., and divorce records of national courts in the UK and Germany. Firm data includes the largest firms of the U.S. and worldwide taken from a stock index and two popular rankings. As shown in Table 1 (Dow Jones IA 30, 2012; Financial Times Global 500, 2012; Fortune 500 Archive, 2012; Marriages Germany, 2013; Marriages U.K., 2013; Marriages U.S., 2012), the used data sets cover hundreds of thousands of marriages and thousands of firms across multiple decades. Recent years include marriages and firms with not yet occurred or unknown failure dates, which skew the data toward the right and result in an overrepresentation of young marriages and young firms. Hence estimated failure rates are upper bounds of the real values (Marriages Germany, 2013; Marriages U.K., 2013; Marriages U.S., 2012). In addition to this skewness, U.S. census based marriage data is representative in all demographic dimensions (Marriages U.S., 2012), whereas UK and Germany include the entire divorced population (Marriages Germany, 2013; Marriages U.K., 2013). Although firm survival data are subject to many factors, such as industry, booms, or recessions, in this paper we neither distinguish their influences nor control for them, but we do look for a pattern in their combined outcome as measured by firm failures. Additional explanations on the methods used for each data set are given in the following results section.

## Results and discussion

First, to analyze failure distributions for marriages, we looked at frequencies of marriage durations  $x$  among all divorces in a given year, normalized by the number of marriages in the corresponding wedding years. By relating each marriage duration to its related marriage cohort, trends like population growth or overall decrease in the number of marriages are equalized. Fig. 1A shows CDFs  $P(x)$  for years of marriage at divorce in the U.S., UK, and Germany. Solid lines are best fits to stretched exponential distributions (Laherrere and Sornette, 1998; Podobnik et al., 2010). Average parameter values of high  $\hat{\beta} = 0.83$  and low  $\hat{\tau} = 4$  imply that the highest divorce frequencies are around 5–8 years, and approach regular exponential distributions ( $\beta = \tau = 1$ ), as shown in Table 2A. Similar parameters across the countries indicate universal social mechanisms

**Table 1 – Data set characteristics.**

Data set	Source	Time horizon	Total no. of marriages (*) or firms (**) included
U.S. marriages	National Center for Health Statistics, U.S.	1990–2010	32,904*
UK marriages	Office for National Statistics, UK	1985–2010	241,110*
Germany marriages	Federal Statistical Office, Germany	1986–2011	377,816*
Fortune 500	Fortune Magazine	1955–2011	2098**
Dow Jones IA 30	CME Group Index Services LLC 2012	1903–2012	118**
Financial Times Global 500	Financial Times	1997–2011	1064**



**Fig. 1 – CDFs of total years of survival at failure (color; 2 column fitting image).**

**Table 2A – Distribution parameters and test statistics for marriages.**

	Parameters			Test statistics	
	A	$\beta$	$\tau$	MSE	KS
U.S. 2010 marriages	1.33	0.83	4.2	0.001	0.037 <sup>a</sup>
UK 2010 marriages	1.05	0.82	3.8	0.001	0.031 <sup>a</sup>
Germany 2011 marriages	1.25	0.85	4.0	0.001	0.016 <sup>a</sup>

<sup>a</sup>  $p < 0.01$ .

**Table 2B – Distribution parameters and test statistics for firms.**

	Parameters			Test statistics	
	$\hat{y}_{min}$	$\hat{\alpha}$	$\hat{\sigma}_{\alpha}$	MSE	KS
Fortune 500	4	1.53	0.01	0.001	0.035 <sup>a</sup>
Dow Jones IA 30	6	1.48	0.05	0.003	0.033 <sup>a</sup>
Financial Times Global 500	4	1.55	0.04	0.001	0.047 <sup>a</sup>

<sup>a</sup>  $p < 0.01$ .

of interaction in marriages. Whereas about 40% of the marriages in Germany and the UK end in divorce within 25 years, almost 50% of marriages in the U.S. end within 20 years, which is consistent with the U.S. Religion and Public Life Survey.

Fig. 1A shows distribution of total years of marriage at divorce for U.S., UK, and Germany. CDFs start at the percentage of marriages that survived 20 years (U.S.) or 25 years (UK, Germany) of observation showing about 50% for the first and 60% for the second. Solid lines represent best fit of stretched exponential distributions for each country with average values of  $\beta = 0.83$  and  $\tau = 4$ . Initial and late years of marriage excluded from fit due to low frequencies.

Second, we analyzed firm failure based on firms' ability to appear year-wise in the Dow Jones stock market, Fortune 500, or Financial Times Global 500 firm rankings. Firm failure has been defined as the inability to stay in a market that combines bankruptcies, mergers, acquisitions, and insignificance due to low revenues or market capitalization (Mitchell,

Shaver, & Yeung, 1994; Sinha & Noble, 2008). After cleaning from simple changes of firm names, we derived an appearance matrix including all firms across the years in each of the three longitudinal data sets. Summation of appearances yields pdfs of firm survival, whereupon Fig. 1B shows CDFs  $P(y)$  of total years of firm survival in a stock market or ranking at failure. For years  $y_i$  larger than a specific lower bound  $y_{min}$ , data on a log-log-scale follow a straight line with  $\alpha \approx 1.5$  indicating power law behavior in the tail, which is consistent with other natural systems showing  $\alpha$  between 1 and 2. A low  $\alpha$  indicates high failure rates, and vice versa. Our  $\alpha$ -values suggest highly negative skewed firm failures, where about 40–50% leave the stock index or ranking within the first 10 years. Fig. 1B shows distribution of total years of firm survival at failure in a large U.S. stock index and two rankings. Solid lines are moving averages. As Table 2B shows, all three distributions are roughly linear for  $y_i > y_{min}$  for  $y_{min} = 6$  (Dow Jones), and  $y_{min} = 4$  (Fortune 500, Financial Times Global 500)

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consistent with power law scale free behavior in the tails. Parallellism points toward similar scaling exponents between the stock market ( $\hat{\alpha} = 1.48 \pm 0.05$ ) and firm rankings (Fortune  $\hat{\alpha} = 1.53 \pm 0.01$ ; Financial Times  $\hat{\alpha} = 1.55 \pm 0.04$ ). Drops at the very end of the tail are due to finite size effects (Axtell, 2001; Newman, 2005).

Tables 2A and 2B also depict test statistics like MSE, and KS for power law and stretched exponential distributions of the five data sets.

Empirical evidence supports the findings of power law distributions for firm failure (Fujiwara, 2004; Luttmmer, 2007; Podobnik et al., 2010) as large social systems, and shows a fit of stretched exponentials for small systems like marriages. Since the summation of stretched exponentials leads to power laws (Stumpf & Porter, 2012; Willinger et al., 2004), and firms consist of many correlated units (Gabaix, Gopikrishnan, Plerou, & Stanley, 2003), the failure at the aggregated level can result from the interplay of small social units. Such interplays in the face of strategic corporate failures have been investigated at boards of directors (Mellahi, 2005) or organizational learning in general (Baumard & Starbuck, 2005).

We propose that fat-tailed distributions of failure result from individuals' least efforts to maintain a social system. A combination of many factors determines the amount of least effort  $g(x)$  an individual puts, i.e.,  $g(x) = \text{attitude}(x) + \text{income}(x) + \text{trust}(x) + \dots$ . Since each successful step forward from wedding or firm foundation makes it easier to spend effort due to gained experience such as joint celebrations or brand attractiveness,  $g(x)$  is expected to be a monotonically increasing function such that  $g(x+1) > g(x)$ . Over time, these positive or negative reinforcements become feedback loops, which are a direct condition for fat-tailed distributions, and especially for power laws (Newman, 2005). In addition, the difference between the success and failure of a particular social system could result from individual beliefs about the survival of the marriage or firm in the future, which determines the direction of putting in the least amount of effort.

## Conclusions

We found strong empirical patterns for marriage and large firm failure across the U.S., UK, and Germany. Failure rates of more than 40% for marriages or 90% for firms across a few decades exemplify fat-tailed probability distributions result from transient dependency of events, in contrast to the common belief of Gaussian ones. Recognizing the ubiquity of power laws in large social systems' failure with characteristic parameters for the U.S. and worldwide could be extended toward patterns of instability of financial markets (Gabaix et al., 2003) or analyzing other social systems of different magnitude. Moreover, our findings can simplify and motivate subsequent analysis of mechanisms for generating power laws from aggregation of fat-tailed distributions (Stumpf & Porter, 2012; Willinger et al., 2004). Initial success allows individuals to gain experience, and leads to reduced efforts by positive reinforcement i.e., growth and underinvestment. Therefore, increasing personal awareness of mature partner selection or periodic counseling by family members to offer moral support during trouble phase of marriage and gradually

bringing change in family culture and thinking (e.g., Welsh, Memili, & Kaciak, 2016) can reduce the number of divorces. Likewise, stakeholder selection and extended board meetings for reinforcing dynamic capabilities of firms (Burisch & Wohlgemuth, 2016) and mutual knowledge creation through strategic alliance (Bouncken, Pesch, & Reuschl, 2016) can help to reduce early failures of firms. Nevertheless, the ties in a social system are susceptible to the volatility of human relationships.

## REFERENCES

- Axtell, R. L. (2001). Zipf distribution of U.S. firm sizes. *Science*, 293(5536), 1818–1820.
- Baumard, P., & Starbuck, W. H. (2005). Learning from failures: Why it may not happen. *Long Range Planning*, 38(3), 281–298.
- Bouncken, R. B., Pesch, R., & Reuschl, A. (2016). Copoiesis: Mutual knowledge creation in alliances. *Journal of Innovation & Knowledge*, 1(1), 44–50.
- Burisch, R., & Wohlgemuth, V. (2016). Blind spots of dynamic capabilities: A systems theoretic perspective. *Journal of Innovation & Knowledge*, 1(2), 109–116.
- Costanza, R., & Patten, B. C. (1995). Defining and predicting sustainability. *Ecology Economics*, 15(3), 193–196.
- Dow Jones IA 30. (2012). *CME Group Index Services LLC.* <http://www.cmegroup.com/> (20.09.12)
- Financial Times Global 500 (2012). <http://specials.ft.com/ft500/may2001/FT31FEOVHMC.html> (20.09.12).
- Fortune 500 Archive (2012). [money.cnn.com](http://money.cnn.com) (20.09.12).
- Fujiwara, Y. (2004). Zipf law in firms bankruptcy. *Physica A*, 337(1), 219–230.
- Gabaix, X. (2009). Power laws in economics and finance. *Annual Review of Economics*, 1(1), 255–294.
- Gabaix, X., Gopikrishnan, P., Plerou, V., & Stanley, H. E. (2003). A theory of power-law distributions in financial market fluctuations. *Nature*, 423(6937), 267–270.
- Laherrere, J., & Sornette, D. (1998). Stretched exponential distributions in nature and economy: “fat tails” with characteristic scales. *European Physics Journal B*, 2, 525–539.
- Liljeros, F., Edling, C. R., Amaral, L. A. N., Stanley, H. E., & Åberg, Y. (2001). The web of human sexual contacts. *Nature*, 411(6840), 907–908.
- Luttmmer, E. G. (2007). Selection, growth, and the size distribution of firms. *Quarterly Journal of Economics*, 122(3), 1103–1144.
- Marriages Germany. (2013). *Federal Centre for Political Education* <http://www.bpb.de/wissen/NHXRDM,0,Entwicklung.der.Scheidungsrate.html> (11.10.13).
- Marriages U.S. (2012). In C. E. Copen, K. Daniels, J. Vespa, & W. D. Mosher (Eds.), *First marriages in the United States: Data from the 2006–2010 National Survey of Family Growth*. US Department of Health and Human Services, Centers for Disease Control and Prevention, National Center for Health Statistics.
- Marriages U.K. (2013). <http://www.ons.gov.uk/ons/rel/vsob1/divorces-in-england-and-wales/2011/sty-what-percentage-of-marriages-end-in-divorce.html> (11.10.13).
- Mellahi, K. (2005). The dynamics of boards of directors in failing organizations. *Long Range Planning*, 38(3), 261–279.
- Mitchell, W., Shaver, J. M., & Yeung, B. (1994). Foreign entrant survival and foreign market share: Canadian companies' experience in United States medical sector markets. *Strategic Management Journal*, 15(7), 555–567.
- Newman, M. E. (2005). Power laws, Pareto distributions and Zipf's law. *Contemporary Physics*, 46(5), 323–351.
- Parsons, T. (1951). *The social system*. Glencoe: Free Press.

- 287 Patton, M. Q. (2005). *Qualitative research*. Chichester: John Wiley & Sons. 299
- 288 290 Podobnik, B., Horvatic, D., Petersen, A. M., Urošević, B., & Stanley, H. E. (2010). Bankruptcy risk model and empirical tests. *PNAS*, 107(43), 18325–18330. 300
- 291 292 Preston, F. W. (1981). Pseudo-lognormal distributions. *Ecology*, 62(2), 355–364. 301
- 293 294 Sinha, R. K., & Noble, C. H. (2008). The adoption of radical manufacturing technologies and firm survival. *Strategic Management Journal*, 29(9), 943–962. 302
- 295 296 Stanley, M. H. R., Amaral, L. A., Buldyrev, S. V., Havlin, S., Leschhorn, H., Maass, P., et al. (1996). Scaling behaviour in the growth of companies. *Nature*, 379(6568), 804–806. 303
- 297 298 Stumpf, M. P. H., & Porter, M. A. (2012). Critical truths about power laws. *Science*, 335(6069), 665–666. 304
- Willinger, W., Alderson, D., Doyle, J. C., & Li, L. (2004). More “normal” than normal: Scaling distributions and complex systems. In R. G. Ingalls, M. D. Rossetti, J. S. Smith, & B. A. Peters (Eds.), *Proceedings of the 2004 Winter Simulation Conference* (pp. 130–141). 305
- Welsh, D. H. B., Memili, E., & Kaciak, E. (2016). An empirical analysis of the impact of family moral support on Turkish women entrepreneurs. *Journal of Innovation & Knowledge*, 1, 3–12. 306
- Zipf, G. K. (1949). *Human behavior and the principle of least effort*. Cambridge: Addison-Wesley. 307
- 308 309 310 311