THE DYNAMICS OF SUCCESS, FAME and CRISES

(Commercial sales, YouTube success, volatility shocks, cyber-risks, conflicts, epilepsy, earthquakes, landslides, social crises, climate,...)



Didier SORNETTE

ETH Zurich Department of Management, Technology and Economics, Switzerland

Member of the Swiss Finance Institute

co-founder of the Competence Center for Coping with Crises in Socio-Economic Systems, ETH Zurich (<u>http://</u> <u>www.ccss.ethz.ch</u>/)

Professor of Physics associated with the Department of Physics (D-PHYS), ETH Zurich

Professor of Geophysics associated with the Department of Earth Sciences (D-ERWD), ETH Zurich

www.er.ethz.ch

EXTREME EVENTS in Natural SYSTEMS

- •Earthquakes
- •Volcanic eruptions
- •Hurricanes and tornadoes
- •Landslides, mountain collapses
- •Avalanches, glacier collapses
- •Lightning strikes
- •Meteorites, asteroid impacts
- •Catastrophic events of environmental degradations



EXTREME EVENTS in SOCIO-ECONOMIC SYSTEMS

- •Failure of engineering structures
- •Crashes in the stock markets
- •Social unrests leading to large scale strikes and upheavals
- •Economic recessions on regional and global scales
- •Power blackouts
- •Traffic gridlocks
- •Social epidemics
- •Block-busters
- •Discoveries-innovations
- •Social groups, cities, firms...
- •Nations
- •Religions...



Endogenous versus Exogenous

Extinctions

Discoveries

-serendipity

-maturation

- -meteorite at the Cretaceous/Tertiary KT boundary
- -volcanic eruptions (Deccan traps)
- -self-organized critical events

Financial crashes

- -external shock
- -self-organized instability

Immune system

- -external viral or bacterial attack
- " internal" (dis-)organization

Brain (learning)

-external inputs

-external shock-cumulative effect of "small" news

Volatility bursts in financial time series

Earthquakes

-tectonic driving

Parturition

-triggering

-mother/foetus triggered?-mother-foetus complex?

-internal self-organization and reinforcements (role of sleep)

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Aviation industry recession -September 11, 2001 -structural endogenous problems Recovery after wars -internally generated (civil wars) -externally generated

Commercial success and sales -Ads -epidemic network Social unrests -triggering factors -rotting of social tissue

Endogenous versus Exogenous

Cancinogenesis

-gene mutations (somatic mutation theory)

-anomalous communications between cells and proliferation of cells is the normal state (tissue organization field theory) (Sonnenschein-Soto)



Cells are in a default state of proliferation and motility — constantly maintaining homeostasis of the tissue through cellular communication and organization.

Disruption of this organization can lead to disease states, such as cancer, as carcinogens target whole tissues, not just individual cells.

Inter-cell interactions depend on local context in tissues, more than genetic programs.

Self-organization?
Extreme events are just part of the tail of power law distribution due to "self-organized criticality"? (endogenous)



Artwork by Elaine Wiesenfeld (from Bak, How Nature Works)

•"Catastrophism": extreme events require extreme causes that lie outside the system (exogenous)

•A mixture? How would it work?





Fluctuation-dissipation theorem far from equilibrium is not expected to hold in general, but...

•Externally imposed perturbations may be different from spontaneous fluctuations (external fluctuations lie outside the complex attractor)

Attractor of dynamics may exhibit bifurcations



D. Ruelle, Physics Today, May 2004

STRATEGY

- •Identify the extremes (and sub-hierarchies)
- Look for local peaks and bottoms
- •Analyze the dynamics around these extremes
 - ★Are they abrupt?
 - ★smooth?
 - ★regular?
 - ★stochastic?
- Identification of different regimes
 - ★ subcritical
 - ★super-critical...
- Diagnostic of underlying mechanism
 Predictability



AMAZON BOOK SALES

- Amazon.com posts a "live" ranking of all its products
- Book ranks in the top 10,000 are updated every hour according to a secret weighting of recent sales and entire history

amazon.com

Top 100 Bestsellers Updated Hourly



1. <u>The South Beach Diet</u> by Arthur Agatston (Author) Price: \$14.97 You Save: \$9.98 (40%) <u>Used & new</u> from \$13.24



2. <u>The Da Vinci Code</u> by Dan Brown (Author) Price: \$14.97 You Save: \$9.98 (40%) <u>Used & new</u> from \$10.80



3. <u>The Last Juror</u> by John Grisham (Author) Price: **\$19.57 You Save:** \$8.38 (30%)

4. <u>South Beach Diet Good</u> <u>Fats/Good Carbs Guide</u> by Arthur Agatston (Author) **Price: \$7.99** <u>Used & new</u> from \$7.80

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The Original "Shock"

- On Friday January 17, 2003, Sornette's recent book jumped to rank # 5 on Amazon.com's sales ranking (with Harry Potter as #1!!!)
- Two days before: release of an interview on MSNBC's MoneyCentral website





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Exogenous Shocks

F. Deschatres and D. Sornette, The Dynamics of Book Sales: Endogenous versus Exogenous Shocks in Complex Networks, Phys. Rev. E 72, 016112 (2005)





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FIG. 8. (Color online) Time evolution of the book "Get with the Program" (see Table III).

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ETH Sumatra Earthquake and Tsunami

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Occuring on December 26, 2004, with a magnitude of between 9.1 and 9.3, it is the second largest earthquake ever recorded on a seismograph. This earthquake had the longest duration of faulting ever observed, between 8.3 and 10 minutes.

It caused the entire planet to vibrate as much as 1 cm (0.4 inches) and triggered other earthquakes as far away as Alaska

Search Queries for the word "Tsunami"





ETHSumatra Earthquake and Tsunami











PHYSICAL REVIEW E 77, 012101 (2008)

Power-law and exponential tails in a stochastic priority-based model queue

G. Grinstein and R. Linsker IBM T. J. Watson Research Center, P. O. Box 218, Yorktown Heights, New York 10598, USA (Received 18 September 2007; published 7 January 2008)



ETH Edgenössische Technische Hochschule Trypical Relaxation Dynamics Swiss Federal Institute of Technology Zurich





Persistence of the use of outdated Web browsers (Firefox, Opera, Chrome and Safari) after users have been prompted to perform an update. Our data is obtained from anonymized daily log files of Google web servers (more than 70% of the worldwide daily searches), collected over more than three years.



Donation response to tsunami



Applications: Signatures of media exposure?



FIG. 3: Eight log-lin plots showing the dynamics of the videos related to the execution of Saddam Hussein. Fits to each dataset are shown as a dashed line and described by a power law relaxation with an exponent in the range $2.4 \le \alpha \le 2.6$.

New Power Law Signature of Media Exposure in Human Response Waiting Time Distributions

R. Crane, F. Schweitzer and D. Sornette, New Power Law Signature of Media Exposure in Human Response Waiting Time Distributions, Physical Review E 81, 056101 (2010)



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Models of epidemics



www.er.ethz.ch 32

Prof. Dr. Didier Sornette

D-MTEC *Chair of Entrepreneurial Risks*

States,

ter er gannen mit

Imitation

-Imitation is considered an efficient mechanism of social learning.



- Experiments in developmental psychology suggest that infants use imitation to get to know persons, possibly applying a 'like-me' test ('persons which I can imitate and which imitate me').

 Imitation is among the most complex forms of learning. It is found in highly socially living species which show, from a human observer point of view, 'intelligent' behavior and signs for the evolution of traditions and culture (humans and chimpanzees, whales and dolphins, parrots).

- In non-natural agents as robots, tool for easing the programming of complex tasks or endowing groups of robots with the ability to share skills without the intervention of a programmer. Imitation plays an important role in the more general context of interaction and collaboration between software agents and human users.

Epidemic branching process

The activity is modeled as a self-excited Hawkes conditional Poisson branching process















ETH Sigenässische Technische Hischiske Miss Federal Institute of Technology Zurich BOOK Analysis





Eidgenössische Technische Hochschule Zürich Swiss Federal Institute of Technology Zurich

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A Shocking Look At...



Chair of Entrepreneurial Risks

Typical Relaxation after a burst of activity



Results: Classifying Relaxation



Predictions of the model



What about precursory information?



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Predicting the rise and fall of social and economic interactions by monitoring and modeling internet activities and commercial sales

- Book, CD music sales...
- Internet searches
- Recommendation Blogs
- Open source software projects
- Ethical Hacking security
- NATO (National Association of Theatre Owners)



Uncover Epidemics in OSS

- Dynamics of committers activity is analyzed for
 - Mozilla
 - Eclipse (data provided by University of Zurich)

CVS (concurrent versioning system)
 all activity has been recorded over projects lifetime (~8 years)
 (almost) no possible bias

s.e.a.l.

Phenomenological approach
 dynamics of commits
 interplay between developers
 relation between generations of developers



Enversity of Zu

Department of Intermatic

(with Thomas MAILLART, ETH Zurich)

Collective Behaviors

in the Software Sphere

Individual patterns similar to those in the information sphere !



H0: Individual Self-reinforcing Process

Method

- Set the "peak activity" to t=0, for all developers
- Build statistical activity by averaging activity over all coders



Collective Behaviors in the Software Sphere



H1: Collective Action

- Is there a relation (self. reinforcing process) between developers?
- The peak size determines (on average) the span of developers activity over time
 - small peak => short contribution
 - large => long contribution
- To test for memory and triggering effects between developers, it is sufficient to test dispersion of peaks in time.



H1: Collective Action

- Heavy-tailed distribution of waiting times between peaks (for each generation)
- Consequences:
 - Scale-free structure of dynamics in work organisation
 - Clusters of activity peaks
 - Developers tend to work together (at the same time)



H2 : Critical Mass and Collective Action

endos/exos theory predicts:

k-th generation is triggered by {1,..,*k*-1} generations

At each generation, dynamics (commits) become "smoother"

Population involved in the epidemic grows as $K(t) \sim t^{\theta}$, with $\theta \approx 0.3$

A. Saichev and D. Sornette, Hierarchy of Temporal Responses of Multivariate Self-Excited Epidemic Processes, Physical Review E (<u>http://arxiv.org/abs/1101.1611</u>)

A. Saichev and D. Sornette, Generating Functions and Stability Study of Multivariate Self-Excited Epidemic Processes, Journal of Statistical Physics <u>http://arxiv.org/abs/1101.5564</u>



with Thomas MAILLART (ETH Zurich)

Hierarchy of Temporal Responses of Multivariate Self-Excited Epidemic Processes

$$\lambda_j(t|H_t) = \lambda_j^0(t) + \sum_{k=1}^m \Lambda_{kj} \int_{(-\infty,t)\times\mathcal{R}} f_{k,j}(t-s) \ g_k(x) \ N_k(ds \times dx)$$

ONE-DIMENSIONAL CHAIN OF DIRECTED TRIGGERING



E (submitted 8 Jan. 2011) (http://arxiv.org/abs/1101.1611)

$$\lambda_j(t|H_t) = \lambda_j^0(t) + \sum_{k=1}^m \Lambda_{kj} \int_{(-\infty,t)\times\mathcal{R}} f_{k,j}(t-s) \ g_k(x) \ N_k(ds \times dx)$$

ONE-DIMENSIONAL CHAIN OF NEAREST-NEIGHBOR-TYPE TRIGGERING





A. Saichev and D. Sornette, Hierarchy of Temporal Responses of Multivariate Self-Excited Epidemic Processes, Physical Review E (submitted 8 Jan. 2011) (<u>http://arxiv.org/abs/1101.1611</u>)

Endogenous critical structure of individual work

- minimizes the energy spent for maximum output
- epidemic like activity of developers
- efficient transfer of knowledge from kth to (k+p)th generation

e Technische HO 254+ H1 + H2 = Colliding in OSS

- Open Source Projects
 - self-propelled by collective action triggering future action
 - joining rate (critical mass) is ensured by a successful epidemic

Outlook

= 1 :

- OSS can be compared a <u>social epidemic</u> in order to <u>produce a good</u>.
- OSS viral organization and dynamics reflect some kind of <u>optimal</u> <u>economic allocation</u> of human ressources

They used the time taken to solve 18 mathematical problems to estimate the probability that P versus NP is solved in 2011.



(Samuel Arbesman and Rachel Courland, Prediction: Proof unlikely, NewScientist, 25 December 2010/January 2011)

Problem Name	Raised By	Solved by	Year whe	Year whe	Years
Honey comb conjectu	Pappus	Hales	350	1998	1648
Kepler's conjecture	Kepler	Hales	1611	1998	387
Fermat's Last Theorer	Pierre de Fermat	Andrew Wiles	1637	1995	358
Catalan's conjecture	Eugène Charles Cata	Preda Mihăilescu.	1844	2002	158
???	???	???	???	???	140
Four Color Theorem	Francis Guthrie	Appel and Haken	1852	1976	124
Prime Number Theorm	Legendre	Hadamard and Poussin	1796	1896	100
Poincare conjecture	Henri Poincare	Grigori Perelman	1904	2002	98
???	???	???	???	???	90
Heawood Conjecture	Heawood	Ringel and Youngs	1890	1968	78
Bieberbach Conjectur	Bieberbach	Branges	1916	1984	68
Mordell conjecture	Mordell	Faltings	1922	1983	61
Oppenheim conjecture	Oppenheim	Margulis	1929	1987	58
Dode cahedral conject	Laszlo Fejes Toth	Hales and McLaughlin	1943	1998	55
Hirsch Conjecture	Hirsch and Dantzig	Leal	1957	2010	53
Burnside conjecture	William Burnside	Feit and Thomposn	1911	1962	51
Smith Conjecture	Paul A. Smith,	Meeks-Yau, et al	1930	1978	48
Kato's Conjecture	Kato	Auscher et al	1953	2001	48
Taniyama Shimura Cor	Taniyama	Breuliet al	1956	2001	45
Road Coloring Problem	Benjamin Weiss	Avraham Trahtman	1970	2009	39
Segal Conjecture	Grame Segal	Gunnar Carlsson	1969	2006	37
Langlands Correspond	Langland	Lafforgue	1967	1999	32
trong perfect graph co	Lovász	Chudnovsky, Robertson	1972	2002	30
Scheinerman conjectu	Scheinerman	Chalopin and Goncalves	1984	2009	25
Star Height Problem	Eggan	Hashiguchi	1963	1988	25
Kruskal's tree theoren	Vázsonyi	Joseph Kruskal and S.	1937	1960	23
Serre's conjecture	Serre	Daniel Quillen and Andr	1955	1976	21
Cameron Erdos conjec	Cameron and Erdos	Green and Sapozhenko	1988	2003	15
Dinitz conjecture	Jeff Dinitz	Fred Galvin	1979	1994	15
Gradient Conjecture	Thom	Kurdyaka, Mostowski ar	1989	2000	11

(with Ryohei Hisano, ETH Zurich)



Endogenous versus Exogenous

•In reality, varying mixture of endo and exo

•Adaptation of individuals to task flows $(\theta \text{ may change and jump to new regimes})$

•Adaptation of network to load and dynamic (epidemic branching ratio may be time dependent and self-organized)

•Coagulation-fragmentation dynamics of networks on time scales comparable to epidemics dynamics

Common group dynamic drives real-world epidemics across social, financial and biological domains



Shenyuan Zhao, Juan Pablo Calderon, Chen Xu, Dan Fenn, Didier Sornette, Riley Crane, Pak Ming Hui and Neil F. Johnson, New dynamical network regime for modern epidemics, in press in Physical Review E (2010)







Empirical Implications

I- ACTION METRICS: what is the efficiency of social compaigns? How to design them better? How to manage in real time (or near-real time) and steer complex social systems, commercial sales, reputation branding, etc?

II- PREDICTING SUCCESS: forecast which product, action, innovation will be successful, where and how to allocate resources.

III-DYNAMICAL ENDO-EXO SEARCH: better search engine using the time dynamics of the endo-exo approach.

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Recovery after wars

-internally generated (civil wars)-externally generated

Commercial success and sales -Ads -epidemic network

Social unrests

-triggering factors-rotting of social tissue