

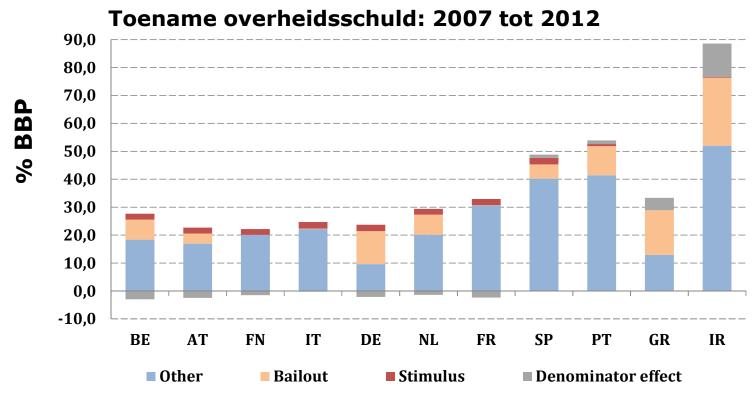
• MEER GRANULAIRE DATA, BETERE RISICO INSCHATTING	



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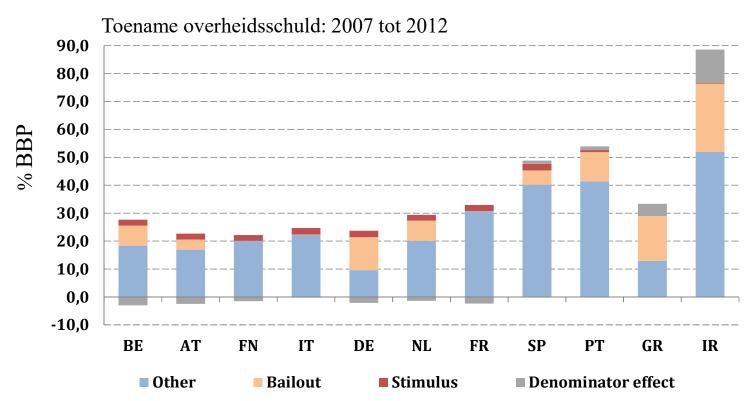
Indirecte kosten veel groter dan bailout





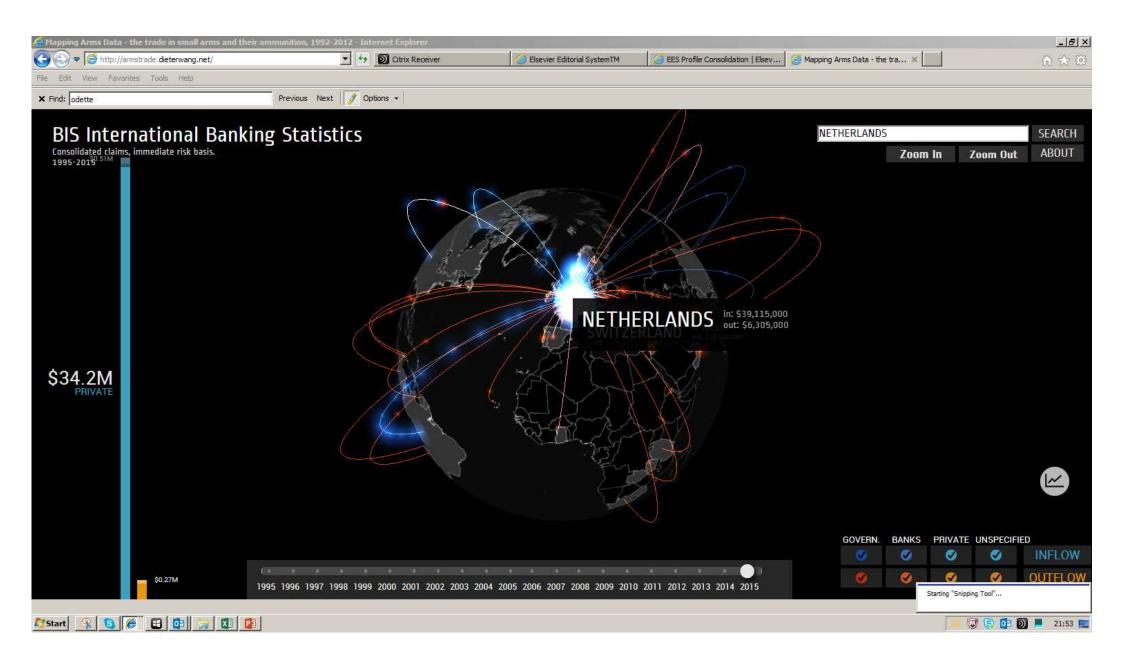
Bron: bijgewerkt op basis van Gilbert en Hessel (2012)

Voor boekje





Bron: bijgewerkt op basis van Gilbert en Hessel (2012)

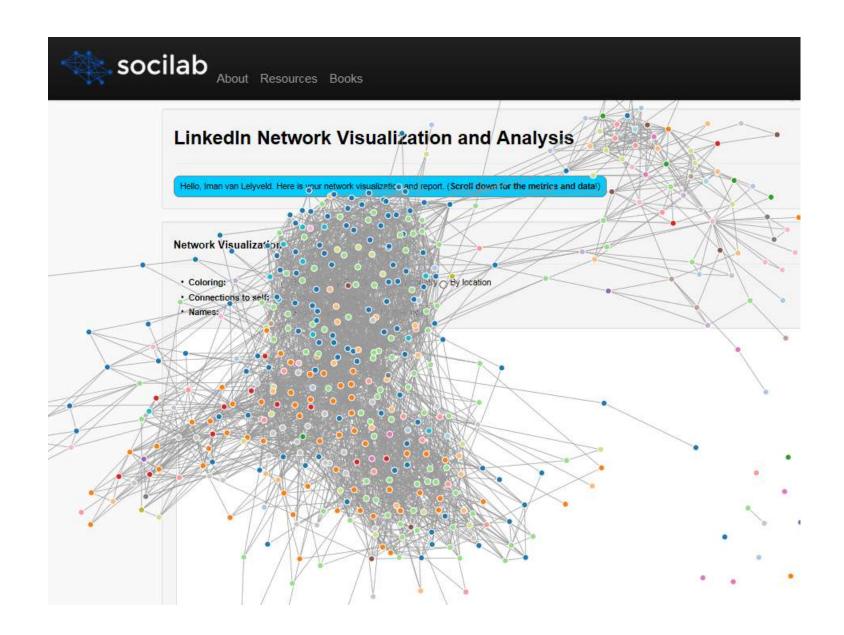




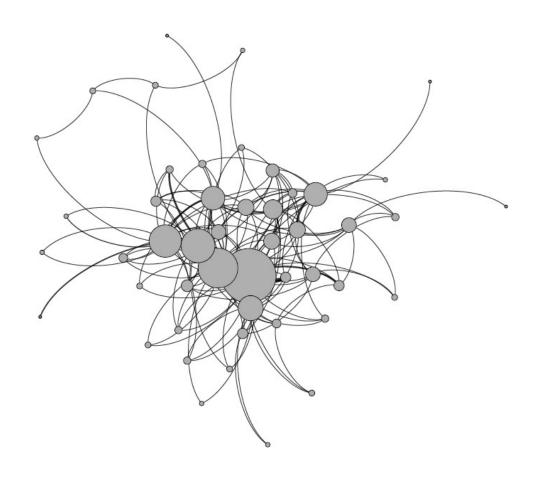








Een netwerk met een kern en een periferie







Peopleimages/iStockphoto

Using network analysis and

the next financial crisis

behavioral modeling to predict

Policy Dashboard based on Complexity Theory

Stefano Battiston, J. Doyne Farmer, Andreas Flache, Diego Garlaschelli, Andrew G. Haldane, Hans Heesterbeek, Cars Hommes, Carlo Jaeger, Robert May, Marten Scheffer

COMPLEX SYSTEMS

Complexity theory and financial regulation

Economic policy needs interdisciplinary network analysis and behavioral modeling

Andreas Flache, * Diego Garlaschelli, * Andrew G. Haldane, * Hans Hee et erbeek, * Cars Hommes, **+ Carlo Jaeg et ***** Robert Max.** Marten Schoff er**

alitional economic theory and no explain, much less prodict, the mar exclusive of the financial system and its box lasting effects on the global occuony. Since the 2008 crisis, there has been increasing inspection using ideas mulically theory to make some of economic and fire reigl markets. Commes, such as tipping points, nat works, contagion, foolback, and resilience have entered the finan-

stage. Regard insights and techniques offer potential for better monitoring and manage-ment of highly intergranacted economic and financial systems and, thus, may help antid-

TEPPING POINTS, WARNING SIGNALS, P. nancial markets have historically solubted may in more cases have been triggered by unpredictable stochastic events. More of-ten, however, there have been endogenous underlying processes at work. Analysis of complex systems ranging from the climate to ecosystems reveal that, before a major transition, there is often a gradual and unnot jeed loss of maillenes. This makes the systan britis: A small disruption can trigger a domino effect that propagates through the system and peopels it into a critis state.

Department of Damiling and France, University of Baltick, Opportune of otherwise and conscious behavior of Charles. OCCUPATION, THE WORLD CHARLES A THE CHARLES A CONSCIOUS AND A CONS Ne Berbanti, "Tableger lastitute, 1927/97/Anstatetien, Ne Berbanti, "Billig Normal Use et http://doi.org/10/10/06/ Chila, "Yeltotan Use ersity, 24-659/atable, German, "Gobal Climate Forum 20/7/Elerle, German, "De parter of Zholog, Use esty of Oablet, Oablet 20/0/20/, USE

Regent remarch has revealed generic on- | looking at systemic risk for the network as pirital quantitative indicators of resilience that may be used across complex systems to detect tipping points. Markers include rising correlation between nodes in a network and rising temporal correlation, variance, and skirminus of fluctuation patients. These indispers were first predicted mathemati-cally and subsequently demonstrated experimentally in real complex systems, including living systems (I). A mount study of the Dutch interbank network (2) showed that standard analysis using a homogeneous network model could only lead to lage desection of the 2006 crists, although a more realistic and henongeneous network model could cial and regulatory koloon, but actual use of complexity models actual use of complexity models after the review (see the first charge). Boologies have developed took to quantum or the contraction of the

tify the stability robustness, and realisms of food with and have shown how those depend on the topology of the network and the strongths of interactions (3). Enidomiologists have tools to gauge the potential for events to propagate in systems of intending entities, to identify asperspreaders and congroups relevant to infect in a newletence, and

Extrapolating results from the natural etiences to economies and finance presents discharges. For instance, publication of an only warning signal will change belowfor and affect future denomics (the Lucas) critique (5)]. But this does not affect the case where indicators are known only to regulators or when the goal is to build ben-

TOO CENTRAL TO FAR. Network effects matter to financial-economic stability be-name shock amplification may occur via trong exceeding effects. For example, the Back of International Sentements recently chains their identity eveloped a framework drawing on data on the intercormectedness between banks to gauge the systemic risk posed to the finan-did network by Global Systemically Impor-tant Banks Recest research on contagion in financial networks has shown that network opology and positions of banks matur; the global financial network may collapse even when individual banks appear safe (6). Capturing these effects is countid for quarti-

a whole. Despite on going efforts, there of facts are unlikely to be routinely considered anytime soon. Information saymmetry within a met-

work-e.g. whore a bank does not know about troubled sourts of other hanks—can be problematic. The hanking network typi-

"...policies and financial regulation...are successful in stabilizing experimental macroeconomic systems"

with a com consisting of a relatively small number of large, densely interconnected banks that are not very diverse in terms of business and risk models. This implies that core banks' defaults tend to be highly cor soluted. Thus, in turn, can generate a collective moral hazard problem (i.e., players take on more risk, because others will hear the costs in case of default), as banks recog that they are likely to be supported by authorities in sit untions of distress, the Ecoshood amplifies their inquetives to hard in

Estimating systemic risk relies on grapular data on the financial network. Unfortunately, business interactions between banks are often hidden because of confidentiality larges. Tools being developed to recommend notworks from partial information and to ottimum systemic risk (7) suggest that pub-licly available bank information does not allow reliable on imption of systemic risk. The publicly separad the number of connec-tions with other banks, even without dis-

focus of interconnections also miles on intogrative quantitative metrics and comopts that reveal important network aspects, such as systemic repercussions of the failure of individual nodes. For example, Debt Rank, which measures the systemic importance of individual institutions in a financial nat-work (6), shows that the issue of too-contralto-fail may be even more important than

REPORTING SCHENCE

AGENTS AND BEHAVIOR. Agent-hu models (ABMs) are computer models which the behavior of agents and their in practions are explicitly represented as docrision rules mapping agents' observations onto actions. Although ABMs are less will established in ambring financia-iconomic systems than in, e.g., traffic control, epide-miology, or bathefield conflict analyses, they have produced promising results. April (8) developed a simple ABM that explains more than those dozen empirical properties of firm formation without recourse to external shocks. AlMs provide a good explanation for why the volumity of perces is clustered on trend-following and harding behavior and time-varying (20) and have been used (15). Then is strong empirical evidence of

Early warning signals of the 2008 crisis in the Datch interbank network. Their gave portrays a temporal

analysis of two knows, many of banks that are at the semestime delitor and conditor to each other. At the soft the

rawnumber of the loops is not very informative about possible orgoing situational dranges, its companion with a random relevant model benchmarks. A z-accesspensions the number of a tandard deviations by which

the number of two locatin thereal nebeark deviate from its expected wike in the model. Small magnitude

persectoral number of Brits. In in the real network (top) and a heterogeneous network where every bank has the

generality of corrections as in the real network (bottom). The homogeneous model often used in standar

to test weremit risk intilications of reforms. I then behaviors in financial markets in test

tion and these controlled laboratory exper-

ments provide more detailed understanding

of mechanisms, ocusulity and conditions fo A simple behavioral model, with agent

gradually switching to better performing

terristics, explains individual, as well as margent macro behavior in these laboratory

conomies. The experiments also provid-

general mechanism for managing model

also identifies a gradual, early-warring "precrisis "phase (2005-2007). [Modified from (7)]

ing Supervision, which show how dynami-

cally changing risk limits can lead to booms and busts in price (II, II). ABMs of nurlest dynamics can be linked with ABM work on

opinion dynamics in the social sciences (II)

to understand how propagation of opinions through social natworks affects energest matte behavior, which is crucial to manag-

ing the stability and resilimor of sudosco-

Laboratory experiments with human subjects can provide empirical validation of individual decision rules of agents, their interactions, and emergent macro behav-ior. Recent experiments studying behavior of a group of individuals in the laboratory show that acomomic systems may device kriffcantly from nabral efficient equ ewis (14). This generic feature of positiv gence of speculation-driven bubbles as crashes, strongly amplified by coordination

nck are accessful in subliking experimen to magroconomic systems when properly schematical understanding of these effects POLICY DASHEDAED, It is an opportuni

prientists, social scientists, ocologists, exi-

deminispints, and meanthers at financial institutions to join forces to develop took from complicity theory as a complement o otistiny opmonic modeliny scornaches (27). One ambitious option would be an or-line, financial-economic dashboard that in-tegrates data, methods, and indicators. This might monitor and stress-test the global so-chemicanic and financial system in something dose to real time, in a way similar to what is done with other complex systems, such as weather systems or sodal networks. The funding required for ownerial policyalorent and fundamental interdedplinary progress in these areas would be trivial com pared with the costs of systemic financial failures or the sollapse of the global financicl-aconomic system. III



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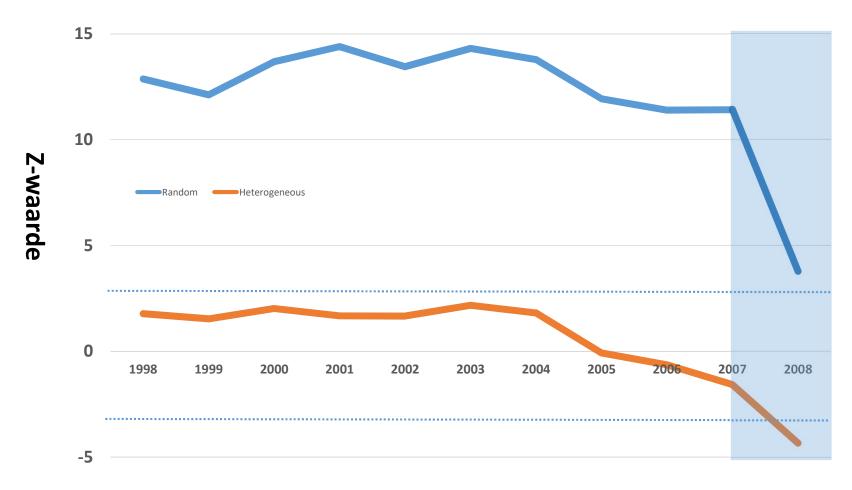
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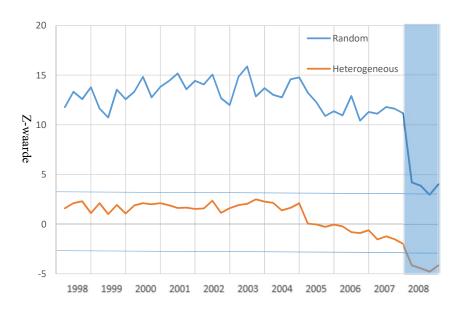
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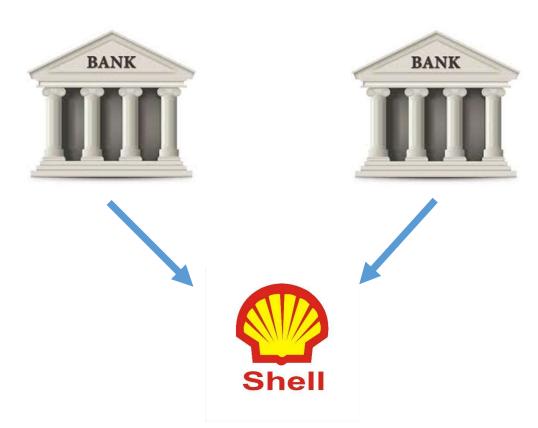
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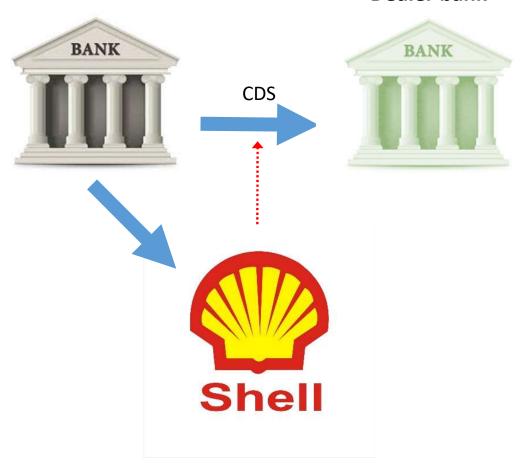






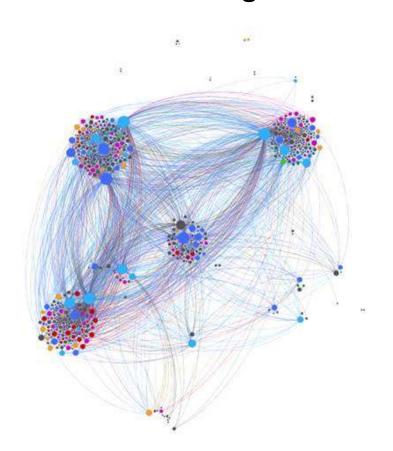


Dealer bank

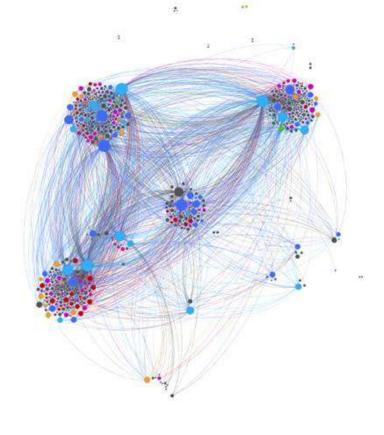




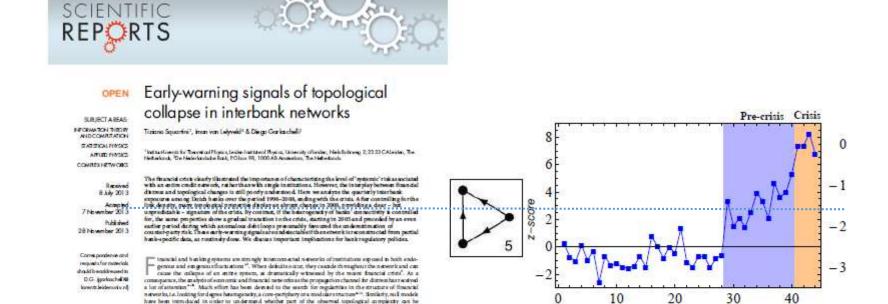
Aandelen en obligaties



CDS



Network structure can help to see change early



Squartini, Van Lelyveld, and Garlaschelli (2013)

explained relatively simply in terms of the observed hatengemetry of vertices 1.4. For interface, necessity specifically, a lot of attention has been devoted in quantifying the level of systemic risk (the risk of the collapse

