# Managing Complexity ? 

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WWW. complex-systems.meduniwien.ac.at
www.santafe.edu

To manage a system means that you are able to predict the possible outcomes of actions you take

If you can not predict the outcome of management actions - you do not manage or control the system: you are subject to luck, fate, external events

## What kind of systems can you predict ?

- Very small ones: physics of a few bodies: planet-sun, quark-quark, rocket-enemy
why ? can manage to handle laws of physics
- Very large ones: gases, solid bodies
why ? do not interact strongly $\rightarrow$ describe laws of physics with laws of statistics
- Managing CS has been out of scope since beginning of mankind
why? too large to handle governing 'laws', too small for statistics to work, too interconnected


## What are Complex Systems ?

- CS are made from many elements
- Elements are strongly interacting with each other
- CS depend on details of the system: who interacts with whom
- CS often pose chicken-egg problems
$\rightarrow$ So far: very hard to handle in predictive ways


## Why is it so hard to predict complex systems?

- Mathematical and statistical tools break down
- Too big to handle
- Not enough data available
- No concept of the backbone of CS - networks


## Typical Complex Systems

- Living systems
- Social systems
- Economic/financial systems
- Firms + organisations
all these systems are evolutionary and are based on networks


## CS are co-evolving multiplex networks



- States of individuals/firms change as a function of NW interaction
- Network changes as a function of the states of the agents first point only: physics
second point: makes it a complex system: society, eco-system, market, ...


## The game changer: The computer + new math

- Network theory: quantify causal processes on networks
- Data availability: electronic fingerprints everywhere
- New statistics: new inference methods and superstatistics
- Storage and computation costs practically nothing

If you do not have all of the above $\rightarrow$ back to start: can NOT manage CS
If you can map a CS into a dynamical NW $\rightarrow$ can manage CS

Theory of CS: combination of dynamical systems and NWs

## Networks

- Network: connections of points by lines
- Usually NW has structure + random components
- Any data that can be stored in database can be represented as network
- Network theory: quantify stability, efficiency, hierarchy, clustering, ...
- Novel mathematics: networks become technically manageable


## Networks are dynamical: here sits the devil !

- Networks change over time
- Dynamical processes happen on networks
- Dynamical processes happen on networks which change (chicken-egg)
- Networks are not independent: they influence each other $\rightarrow$ Multiplex




## Example I <br> What if we know everything? What can we predict?

- then we have solved the data problem $\rightarrow$ good!
- only problem: what to do with all that information?


## Massive Multiplayer Online Game - pardus.at a toy for the new data generation

## Complete knowledge on a human society

Have all data of all 500.000 players of all of their actions and interactions performed in a 'second life' like virtual world www.pardus.at

- have complete knowledge of an entire human society
- have time evolution of the co-evolving multiplex and states



## The properties of the subnetworks



- Positive links are highly reciprocal, negative links are not
- Power-law degree distributions indicate aggressive actions
- Positive links cluster


## Network-network interactions



How does one network shape and influence the other?

Proceedings of the National Academy of Science USA (2010)

## How humans organize to stabilize their social NWs

|  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: |
| Strong formulation of balance | B | U | B | U |
| Weak formulation of balance | B | U | B | B |
| $N_{\Delta}$ | 26,329 | 4,428 | 39,519 | 8,032 |
| $N_{\Delta}^{\mathrm{rand}}$ | 10,608 | 30,145 | 28,545 | 9,009 |
| z | 71 | -112 | 47 | -5 |

Social balance theory - test empirically with natural science quality

Gender differences in 'networking'


E

## Predict: Where will you go next ?



Scientific Reports (2012)
W\%
Mynimicisi $\square$ e

## Alternative representation of humans - behavioral code

Actions every (human) player can engage in life (game)

C ... communicate
T ... trade
F ... establish a friendship link
X ... remove an enemy link
A ... attack
B ... place a bounty on someone
D ... delete a friendship link
E ... establish an enemy link

## Action-streams



Player 199 all ...CCAABCAAAAATTTAAATCCCCCCTBXCCFFFF.
$\rightarrow$ Analyze the code as if it was the genome

## Predict: What is your next action ?



PLoS ONE (2012)

## Example II <br> Complexity in financial networks and systemic-risk management

- If you lend something to somebody: want to know creditworthiness
- In a network can not do that, unless know riskiness of EVERYBODY
- No rational decision making on lending possible without transparency
- Central Banks have almost complete information


## Interbank credit NW of Austria



Asset-liability NW of all Austrian banks, October 2003
Quantitative Finance (2005)

## All financial flows between Austrian banks


aggregated 2005-2006, 211 Banks, 4.187.943 transactions, volume 11.07 trillionEUR
European Physics Journal B (2009)

## Financial networks - management of systemic-risk

- With this information $\rightarrow$ define a systemic risk measure: DebtRank
- Can regulate the interbank system that it becomes systemically risk free
- Idea: forbid borrowing from systemically risky banks

http://www.bloomberg.com/news/2013-02-10/fix-finance-by-shedding-light-on-its-complexities.html


## Example III <br> What is complex in a firm or corporation ?

- Corporation is an evolutionary network of communication-flows
- Management controls these flows and tries to re-arrange the NW
- With and without management: the network evolves = re-arranges
$\rightarrow$ CS tools assist to:
- know the network (reality check)
- find ways to re-arrange it (optimize)
- monitor its change after managerial intervention

Note: it is not easy to tell a network how to re-arrange !

## Why CS in corporations?

Imagine new CEO entering a firm with say more than 1000 employees

- Knows organigram. Knows what departments should do + hierarchy
- Does not know: what departments are in reality
- Are departments structured in reality as the CEO thinks they are?
- How hierarchical is the firm in reality?
- Do re-structuring interventions work?
- Do optimal solutions to organization structure exist, given real structure
$\rightarrow$ Answer to this: communication flows


## Communication: the nervous system of a firm

- Telephone bill: every call = one line

ID caller | dpt caller |ID called | dpt called | time | duration

```
100005050404716102009140100 00 14
```

1000350500912041120091028000004
1000350500322041120091627000110
1000450504047300920090827000258

- emails: log-files on server: every mail = one line

ID Sender \| dpt sender \| ID recipient \| dpt recipient \| kB | time sent
100001150819350948620091103071315
100001150819350344420091103071315
100001150948550299620091103132711
100001150948550312220091103132711

## emails of corporation, december 2011



- what do we see? nothing! $\rightarrow$ network theory
with kind permission from Günther Weiss
emails: max. spanning tree - departments, dec 2011

- Support to questions: what is state of the firm - is restructuring needed?
- Degree of clustering $\rightarrow$ rethink dept. structure? monitor restructuring?
with kind permission from Günther Weiss



## Destroy the core and you collapse !

- Loss of core often leads to collapse of network


with kind permission from Günther Weiss


## Conclusion

- Complexity arises through inter-connectedness: networks
- Science: complexity catastrophe possible: quick \& drastic changes
- If can map CS to dynamical co-evolving NW $\rightarrow$ can manage it
- Can manage systemic-risk (risk of drastic change - collapse)


## Conclusion II message for strategic management

- Communication-network monitoring
- know your corporation
- restructure departments
- monitor restructuring events
- Core-detection of a corporation
- verify keystone-emlpoyees
- identify potentials easy to realize: AC cycle analysis
- identify cores
- Problems with these techniques:
- Legal issues, privacy rights, anonnymization, and data storage

