



#### Assessment, benchmarking and stress-testing resilience of critical infrastructures: A novel, indicator-based approach developed in the EU project SmartResilience

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#### Abstract

The contribution highlights the practical/implementation aspects of new EU project SmartResilience and its application in terms of resilience assessment, resilience benchmarking and stress-testing. The project is fully aware of the limitations and pitfalls of quantitative approaches when assessing complex, timedependent issues such as resilience of critical infrastructures. The project proposes to rely on the concept of "resilience matrix", redefined in such a way that it encompasses also the early (e.g. emerging risks related considerations), on one side, and the final process of learning and adaptation on the other side, i.e. other wend of the resilience cycle. In particular, the project looks also at the aspects related to the fact that modern critical infrastructures are becoming increasingly "smarter" and that this "making the infrastructures smarter" usually means making them smarter in normal operation and use. This is, however, an issue to be verified, if smart critical infrastructures will behave "smartly" and be "smartly resilient" also when exposed to extreme threats, especially the new one such as extreme weather disasters or, e.g., terrorist attacks. The paper focusses onto two main issues. The first being the indicator-based approach which comprises the identification of existing indicators suitable for assessing resilience of SCIs, identification of the new "smart" resilience indicators including those from Big Data, development of the new advanced resilience assessment methodology based on smart RIs ("resilience indicators cube", including the resilience matrix). The second one is the application of the methodology and the approach developed in the project, onto eight case studies in Europe. Beside the resilience assessment, the approach and the methodology are intended to be applied for benchmarking and stress-testing, in the later stages of the project.

#### Acknowledgments

The paper is based on the Grant Agreement No. 700621 supporting the work on the SmartResilience project provided by the Research Executive Agency (REA) ('the Agency'), under the power delegated by the European Commission ('the Commission'). This support is gladly acknowledged here, as well as the collaboration of all the partners and their representatives (persons) involved.





# Assessment, benchmarking and stresstesting resilience of critical infrastructures:

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project SmartResilience





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## **Abstract - keywords**

- Dependencies > interdependencies > stress testing (in critical infrastructures)
- □ Framework:
  - a. Characteristics: upstream, internal, downstream
  - b. Classes: physical, cyber, geographic, and logical
  - c. Dimensions: operating environment, coupling and response behavior, type of failure, infrastructure characteristics, and state of operations
- "Smart" Critical Infrastructures (the SmartResilience project)
- Practical Method
- (expected) Results / Applications







Smart Resilience Indicators for Smart Critical Infrastructures



## "Smart" Critical Infrastructures

## (the SmartResilience project)

## **Smart Critical Infrastructures**

(in SmartResilience project)









Smart Resilience Indicators for Smart Critical Infrastructures



## **Interdependencies > Stress testing**

## Map the safety/security landscape... (the SmartResilience project example)





Smart Resilience Indicators for Smart Critical Infrastructures



## Dependencies > interdependencies > systemic risks (in critical infrastructures)





#### Smart Resilience Indicators for Smart Critical Infrastructures Characteristics:



upstream, internal, downstream

**Classes:** 

## physical, cyber, geographic, and logical

Dimensions:

operating environment, coupling and response behavior, type of failure, infrastructure characteristics, and state of operations



## Stress-testing: resilience of interdependent infrastructure (systems)?

A multiplex network is a collection of networks on the same set of nodes



system in 3 months for passengers

4 weeks





Smart Resilience Indicators for Smart Critical Infrastructures



## Practical Method Conventional Indicators

# What when the "risk happens"?

Linkov et al. 2014, ANL 2012







## **Resilience matrix**

| Dimension  | s" of the Resilience              |   |  |              |                 |               |              |            |
|--|-----------------------------------|---|--|--------------|-----------------|---------------|--------------|------------|
| Linkov Error!<br>Reference<br>source not<br>found.<br>4 dimensions | T1.2:<br>5 dimensions             | Comments  |  |              |                 |               |              |            |
| 1. Physical  | 1. System / physical              | Includes technological aspects of the give<br>physical/technical networks being part of<br>interconnectedness with other infrastruc | n infrastructure, as well as the<br>a given infrastructure,<br>tures and systems |              |                 |               |              |            |
|  | 2. Information / data             | Includes also the technical systems dealir  | g with information/data  |              |                 |               |              |            |
| 2. Information<br>(Data)   | 3. Organizational /<br>business   | Includes business-related aspects, financi different types of respective organization   | al and HR aspects as well as<br>al networks                                      |              |                 |               |              |            |
| 3. Cognitive<br>(Decision<br>Making)                               | 4. Societal / political           | Includes the broader societal and social a directly involved in the operation and/or social networks)                               | antavt also stakoholdors not   | S            | are             | pu            | er           |            |
| 4. Social  | 5. Cognitive /<br>decision-making | Includes the perception aspects (e.g. per vulnerabilities)  | Phases $\rightarrow \rightarrow \rightarrow$                                     | nd risł      | , prep          | ithsta        | recov        | learn      |
|  |                                   |   | vs.<br>Dimensions<br>↓↓↓   | 1. Understar | 2. Anticipate / | 3. Absorb / w | 4. Respond / | 5. Adapt / |
|  |                                   |   | 1. System / physical   |              |                 |               |              |            |
|  |                                   |   | 2. Information / data  |              |                 |               |              |            |
|  |                                   |   | 3. Organizational / business   |              |                 | 5×5           |              |            |
|  |                                   |   | 4. Societal / political  |              |                 |               |              |            |
|  |                                   |   | 5. Cognitive / decision-makir  | ng           |                 |               |              |            |







## **Resilience cube in the context**



## Example



### What is anticipation? How do we know what to expect?









## Resilience Matrix: Phases/dimensions + issues & indicators







## **Outline of assessment methodology**

Simple, transparent and easily understood ...







# ICT, Cascading effects & Smartness: NOT ONLY infrastructures are interdependent... also threats!





\* ICT has an overarching role, affecting other CIs



## **Proposed SmartResilience method steps**

- 1. Select the area, e.g. a smart city *Level* 1
- 2. Select the relevant critical infrastructures (CIs) *Level 2*
- 3. Select relevant threats for each CI, i.e. define the "scenario" *Level* 3
- 4. Consider each phase (in the resilience matrix) for each threat *Level 4*
- 5. Define the issues within each phase (structured/categorized according to the dimensions in the resilience matrix) *Level 5*
- 6. Search for the appropriate indicators for each issue *Level 6*
- 7. Determine best and worst values for each indicator
- 8. Assign real values to the indicators
- 9. Run the calculation and save the "assessment"
- 10. Use results/compare: (a) to previous assessment ("trend"), (b) to other assessments ("benchmarking"), or (c) to set criteria ("stress test")





## Run calculations in database, save and use results





Smart Resilience Indicators for Smart Critical Infrastructures



## **Big Data Indicators**

## From Big Data to interconnectedness indicators



## **Examples of measures: Centrality, betweenness, Katz**

- 1. degree centrality
- 2. betweenness centrality
- 3. closeness centrality,
- 4. eigenvector centrality (Bonacich 1972)
- 5. Bonacich power centrality (Bonacich 1987),
- 6. flow betweenness centrality (Freeman 1991)
- 7. fragmentation centrality (Borgatti 2006),
- 8. reach centrality (Scholtes et al. 2016)
- 9. proximal betweenness (Borgatti et al. 2013),
- 10. mutual information (Jin et al. 2012)
- 11. local clustering coefficient (Jin et al. 2012)
- 12. modularity centrality (Newman 2004)
- 13. Katz prestige





Measure High Low (A) (B) Resilience **Clustering Coefficient** (C) (D) Vulnerability Betweenness Centrality (E) (F) Efficiency

Principal Eigenvalue, Katz Prestige





## **Example: Communication network**



## Network 1



### Network 2







## **Communication network - Summary**



👪 🌑 🕥 SINTEF



## **Communication network - Clusters**



st W 🛛 🕦 SINTEF



## **Betweenness centrality**

## Katz prestige



- -----Salgótarjáni Helyi Védelmi Bizottság B
- -----Nógrád megye MVB B
- Nógrád Megyei Rendőr-főkapitányság B
- Katasztrófavédelmi Koordinációs Tárcaközi Bizottság Nemzeti Vészhelyzet-kezelő Központ
- BM-Országos Katasztrófavélmi Főigazgatóság
- Pest Megyei Rendőr-főkapitányság A
- Országos Rendőr Főkapitányság



- Balassagyarmati Helyi Védelmi Bizottság B
- Pest megye MVB B
- Nógrád megye MVB B
- Nógrád Megyei Rendőr-főkapitányság B
- Katasztrófavédelmi Koordinációs Tárcaközi Bizottság Nemzeti Vészhelyzet-kezelő Központ
- Pest megye MVB A
- BM-Országos Katasztrófavélmi Főigazgatóság
- Országos Rendőr Főkapitányság





## **Communication networks**



Each circle represents an organization, each connection (link) an information flow between the two organizations







Each point is a disruptive events with participants being either prepared (red) or unprepared (blue)







Smart Resilience Indicators for Smart Critical Infrastructures



## **Results / Applications**

## **Down to practical problems...**

| Infrastructure (CI) /<br>Scenarios |  | Terrorist<br>attack | Cyber<br>attack<br>Extreme weather<br>incl. NaTech<br>events |     | IC-specific<br>events                             | Cross-<br>cutting<br>issues |
|------------------------------------|--|---------------------|--|-----|---|-----------------------------|
| 1.                                 | Smart cities<br>(Germany, UK, Ireland)   | ✓                   | ~  | (√) | Social unrest,<br>urban floods                    | :                           |
| 1.                                 | Smart health care<br>(hospitals, Austria)  | (✓)                 | ~  | (√) | Massive<br>breach of<br>privacy                   | gislation                   |
| 1.                                 | Smart energy supply<br>systems (Finland)   | ~                   | (√)  | (√) | Solar storms<br>(space<br>weather)                | ments, le                   |
| 1.                                 | Smart<br>industrial/production<br>plants (new and<br>refurbished plants,<br>Industry 4.0 plants) | ✓                   | ~  | V   | Interruptions<br>in the critical<br>supply chains | urance, law enforce         |
| 1.                                 | Smart transportation<br>(airports; Hungary)  | ✓                   | ~  | ~   | Border control                                    | Insi                        |









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## **Use of Big Data**

## World Input Output Network



Supply-use network between sector X in country A and sector Y in country B, 1995 (left) and 2011 (right)





# WIOD ...

|                                   |           | l          | U <b>se by co</b> i | untr | y-industrie   | es |               | Final use |               |                  |           |  |
|-----------------------------------|-----------|------------|---------------------|------|---------------|----|---------------|-----------|---------------|------------------|-----------|--|
|                                   |           |            | Country 1           |      |               | Co | Country M     |           | Country<br>1  | <br>Country<br>M | Total use |  |
|                                   |           |            | Industry<br>1       |      | Industry<br>N |    | Industry<br>1 |           | Industry<br>N |                  |           |  |
|                                   |           | Industry 1 |                     |      |               |    |               |           |               |                  |           |  |
|                                   | Country 1 |            |                     |      |               |    |               |           |               |                  |           |  |
| Supply from                       |           | Industry N |                     |      |               |    |               |           |               |                  |           |  |
| country-                          |           |            |                     |      |               |    |               |           |               |                  |           |  |
| industries                        |           | Industry 1 |                     |      |               |    |               |           |               |                  |           |  |
|                                   | Country   |            |                     |      |               |    |               |           |               |                  |           |  |
|                                   | M         | Industry N |                     |      |               |    |               |           |               |                  |           |  |
| Value added by labour and capital |           |            |                     |      |               |    |               |           |               |                  |           |  |
| Gross output                      |           |            |                     |      |               |    |               |           |               |                  |           |  |

- $\Box$  X<sub>i</sub>... Output ("supply") of sector i
- □ A<sub>ij</sub> ... Technical coefficient: € of input from sector i needed to produce € output in j (input-output network)
- $\square$   $D_i$  ... Final consumption ("use") in sector *i*
- □ Assume standard Leontief economy: *X*=*AX*+*D*
- □ **Absorb**: Apply shock  $\delta$  to sector k:  $B_{ij} = A_{ij}(1-\delta)$  if i=k or j=k.

**Recover**: Assume that after shock there will be investments in rebuilding the infrastructure of size  $\Sigma_j A_{kj} \delta$ **RAP** *Γ* 



## **Example: Financial Crisis 2008**



#### USA: Activities auxiliary to financial services and insurance activities

Area = resilience loss





## **Validation of Resilience Indicators**

# RIs are directly related to size of output fluctuations across individual sectors of a country!









## **CHARLIE: Health infrastructure Austria**









- Multi-factorial diseases = consequences of defects in various types of networks that determine health
- Multimorbidity: one defect may increase risk for various diseases
- Need to understand these networks and how they influence each other to repair them
- *"Next-generation phenotyping"*: a novel, data-driven and pathobiologically informed approach to understand human diseases and their interconnections







patients with diabetes and pancreatic cancer

 size of nodes = disease prevalence





## **Comorbidity networks**







## **Predict incidences using comorbidity networks**



population-wide forecast of 85%-95% of all disease incidences within the next ten life years

Chmiel A, Klimek P, Thurner S, New J Phys 16, 115013 (2014)







Identify comorbidities  $\rightarrow$  Check causation  $\rightarrow$  Treat causing diseases







- Check diabetes for all possible known or unknown comorbidities equivalent to 40k single epidemiological experiments → ≈100 highly significant comorbidities
- Confirmed controversial relation between diabetes and Parksinon's Disease.
- Strong gender effects: Lower risk for hypertension for females in fertile age, for example.
- Can partially check whether comorbidity relation is causative of consequential
- Type 1 diabetes typically present before onset of depressions.
- Schizo-affective disorders often lead type 2 diabetes
  → drug interaction?

Klimek P, Kautzky-Willer A, Chmiel A, Schiller-Frühwirt I, Thurner S, PLoS Comput Biol 11(4): e1004125 (2015)







## Negative ripple effects within and to other countries







## **Shock in DEU -> AUT profits**









Smart Resilience Indicators for Smart Critical Infrastructures



# Conclusions – Take away Human thinking is (mainly!) 1-dimensional and linear – resilience data are multi<sup>n</sup>-dimensional and highly nonlinear

## A (global) "bridge" is needed!

- Give a new meaning to a SINGLE INDICATOR for RESILIENCE of an "infrastructure-ofinfrastructures"
- Where are the indicators? Make clear how the network-based measures can be used as resilience indicators
- Visualization: align numbers with feeling (e.g. by means of intuitive visualization!)
- Make sure that the use of "big-data-indicators" will be aligned and integrated with the use of conventional indicators





# Conclusions - Resilience: Emerging and Systemic Risks

- Challenge 0: In theory, we all talk about INTERdependencies, but, in practice, we hardly DEPENDENCIES
- Challenge 1: Intuitively, we incapable to understand the dependencies above "3<sup>rd</sup> level" and can have only a gut feeling about INTERdependencies. Visualization: can help to align numbers with feeling (e.g. intuitive visualization!)
- Challenge 2: The swarm of the black swans systemic risks!
- Challenge 3: How to make sure that the use of "big-data-indicators" is not misused (e.g. "used" for fake news)
- Challenge 4: Know the limits of methods and tools ("radars", including the big data ones!)
- □ Challenge 5: Know the limits: Sky/world are **NOT** always the right limit!







## **Conclusions: Resilience radar?**



## Legal note - Acknowledgment



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The research leading to these results has received funding from the European Union's Horizon 2020 Research and Innovation Programme, under the Grant Agreement No 700621. The views and opinions in this document are solely those of the authors and contributors, not those of the European Commission.



