

# Computational Models of Systems Resilience and Application on Cybersecurity

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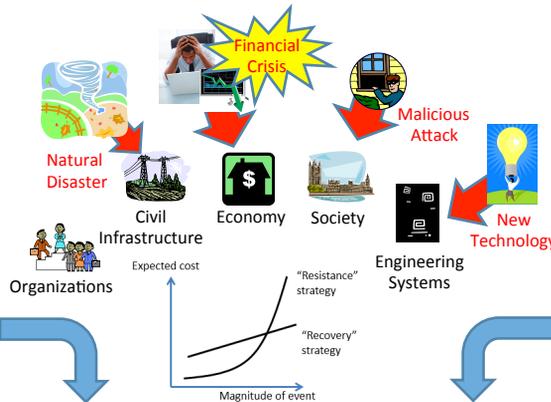
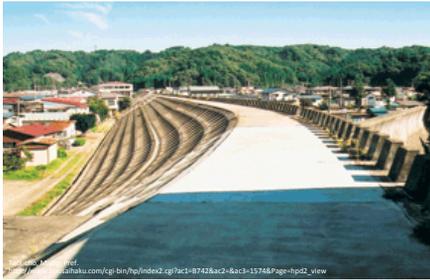
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## Systems Resilience

Project of Transdisciplinary Research Integration Center

**Goal: How to make our systems more resilient against large perturbations?**



### Abstraction of problems: SR-Model

- Mathematical foundations/models
- Symbolic representation (Artificial Intelligence)

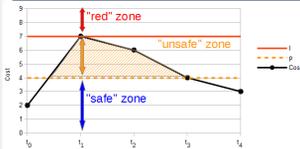
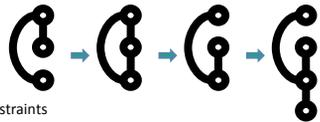
### Design of resilient systems:

- Uncertainty
- Robustness analysis
- Dynamic models

## SR-Model

SR-Model (Schwind *et al.*, AAMAS 2013)

- Dynamic systems
- Multi-agent systems
- Constraint-based systems
- Flexible, can add/delete agents/constraints



$$\text{Resistance} + \text{Recoverability} = \text{Resilience}$$

### Summary:

- Several properties to characterize the resilience of dynamic systems (*f*-resistance, *c*, *p*, *q*-recoverability, *f*-functionality, *s*-stabilizability)
- Very important framework for the design of "robust" dynamic systems in many fields

### Open problems:

- **Theoretical complexity:** given a dynamic system and some fixed parameters *l, p, q, f, s*, does our dynamic system satisfy all properties listed above?
- **Optimization problems:** if our dynamic system must be *f*-functionable and *s*-stabilizable, how recoverable can it be?

### Related Publications:

Nicolas Schwind, Tenda Okimoto, Katsumi Inoue, Hei Chan, Tony Ribeiro, Kazuhiro Minami, Hiroshi Maruyama: "Systems Resilience: a Challenge Problem for Dynamic Constraint-Based Agent Systems". In Proceedings of the 12<sup>th</sup> International Conference on Autonomous Agents and Multi-Agent Systems (AAMAS 2013), pp. 785-788 (Challenges and Visions Papers 3<sup>rd</sup> prize).

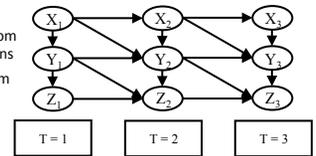
## Robustness Analysis of Dynamic Models

### Summary:

- **Uncertainty:** Some information of the system configuration may be uncertain
- **Robustness Analysis:** Study how outputs of model change given perturbations (e.g., environmental changes, unexpected events, estimation errors) in inputs of model
- **Dynamic Models:** Represent systems that evolve over time due to actions and/or external events

### Relevance to Resilience:

- Check whether conclusions drawn from model are robust against perturbations
- Determine whether changes in system design improve system robustness
- Make tradeoffs between robustness and functionality



### Relevance to System Design:

- For model builders, who design and debug models: What are the "weak" points of model that may contribute to large variations in output? What components we can change to improve model robustness?
- For decision makers, who use and evaluate models: What are the causes of certain decisions being made based on the model? How confident are we in the decisions against uncertainty?

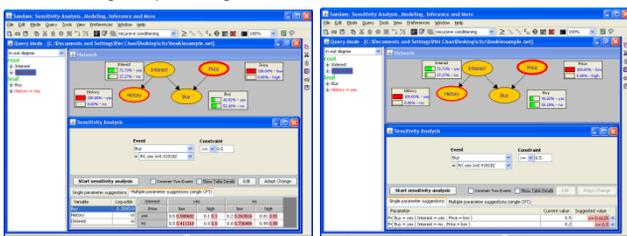
### Related Publications:

- Hei Chan, Sensitivity Analysis of Probabilistic Graphical Models, Verlag-Muller, 2009.

## Example: Bayesian networks

### Summary:

- Bayesian networks can be used to model uncertain and dynamic systems
- For robustness analysis, compute derivatives of probabilities of interest w.r.t. parameters
- Find solutions where parameter changes can enforce query constraints
- Experts can make guarantees of systems resilience in the face of unexpected events, or whether changes in system design will affect current conclusions



## Application: Cybersecurity

### Summary:

- A set of devices (servers, laptops, tablets) must work to provide service to citizens
- Hackers try to attack units to bring down service
- Administrators take actions (upgrade, fix) to keep devices working

