Modeling Cyber-Insurance Towards a Unifying Framework

Rainer ${\rm B\ddot{o}hme}^{\star}$ and Galina ${\rm Schwartz}^{\dagger}$

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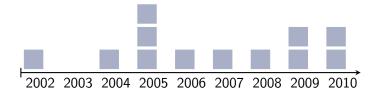
November 10 - 11, 2010 TRUST Workshop at Stanford University





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Cyber-Insurance: Research Papers



Cyber-Insurance

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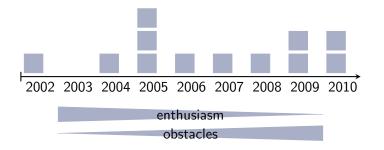


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- 1. Characteristics of Cyber-Risk
- 2. Framework Overview
- 3. Selected Features
 - Network topology
 - Unified approach to interdependent security and correlated risk
- 4. Discussion and Conclusion



Characteristics of Cyber-Risk

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success factors of ICT

distribution & interconnection

universality & reuse

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success factors of ICT

Cyber-risks [focal features]

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distribution & interconnection \rightarrow interdependent security

own security depends on other parties' actions (security)

universality & reuse

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success factors of ICT Cyber-risks [focal features]

distribution & interconnection \rightarrow interdependent security

universality & reuse

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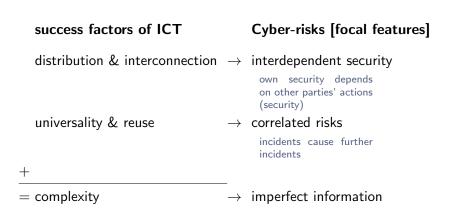
own security depends on other parties' actions (security)

$\rightarrow~$ correlated risks

incidents cause further incidents

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Textbook risks [economics & insurance literature]

neither interdependence nor correlation

Airline baggage security

interdependence, but no correlation

Kunreuther & Heal, 2003

Natural disasters in the actuarial literature

spatial correlation, but no interdependence

Embrechts et al., 1999

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Cyber-insurance

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BOTH interdependence and correlation

Textbook risks [economics & insurance literature]

neither interdependence nor correlation

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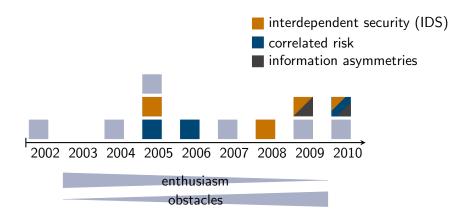
Natural disasters in the actuarial literature

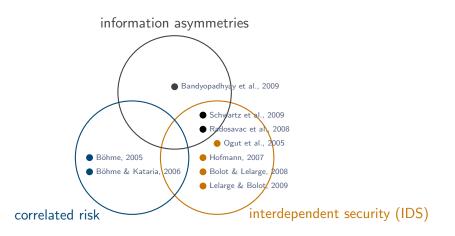
spatial correlation, but no interdependence

Embrechts et al., 1999

Cyber-insurance

BOTH interdependence and correlation [never modeled together so far]





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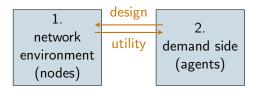


Framework Overview

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1. network environment (nodes)

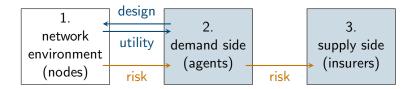
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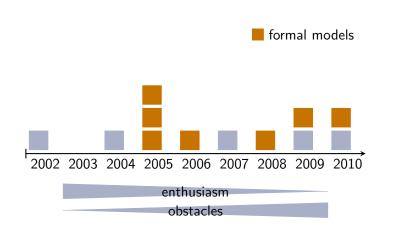
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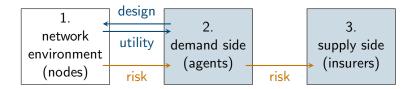
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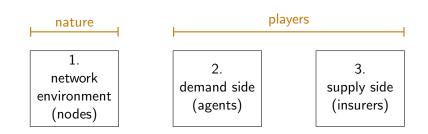
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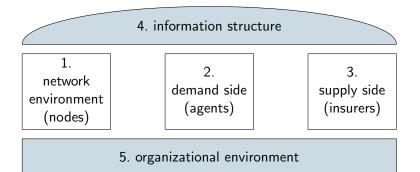
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Overview of Model Attributes

1. network environment

defense function network topology risks features attacker model

2. demand side

node control heterogeneity agent risk aversion action space & timing

3. supply side

market structure insurer risk aversion insurer markup contract design

4. information structure

Information asymmetries Their timing: ex ante (adverse selection) ex post (moral hazard)

5. organizational environment

regulator(s) ICT manufacturers network intermediaries security service providers

Cyber-insurance market

Under which conditions will cyber-insurance thrive?

Network security

Can we expect fewer attacks if cyber-insurance is broadly adopted?

Social welfare

Will the world be a better place with cyber-risk reallocation?



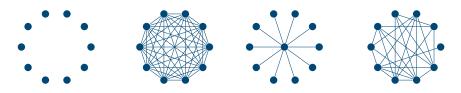
Selected Features

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Network Topology

Examples



ideosyncratic fully connected single-factor model Erdös-Rényi graph

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Network Topology

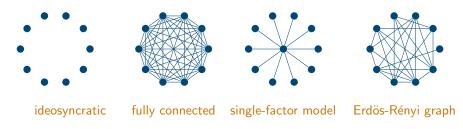
Examples



ideosyncratic fully connected single-factor model Erdös-Rényi graph hardware failure email spam OS vulnerability inter-organizational dependence

Network Topology

Examples



hardware failure e

email spam

OS vulnerability

inter-organizational dependence

 \rightarrow Comprehensive insurance policies are **bundles of contracts**.

Defense function *D* for node *i* (security interdependence only):

$$P_i = D(I_i, w_i, \mathbf{s}, G, \dots)$$

- I_i size of loss
- w_i initial wealth
- **s** vector of security investments: $\mathbf{s} = s_i \cup \mathbf{s}_{j \neq i}$
- G network topology

Defense function *D* for node *i* (simplified):

$$p_i = D(s_i, \mathbf{s}, G, \dots)$$

Node *i* security s_i $D \downarrow$ probability p_i

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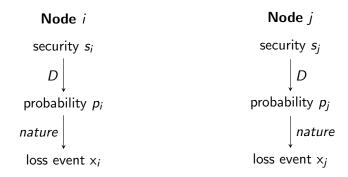
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Node i
security s_i
D \downarrow
probability p_i
nature \downarrow
loss event x_i
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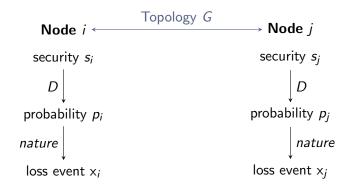
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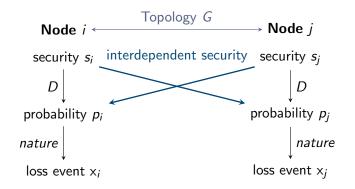


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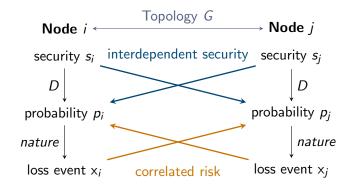
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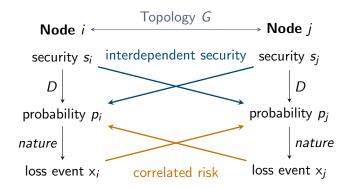




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Modeling interdependence AND information asymmetries is hard; modeling correlated risks is hard. requires recursive methods; may lead to complex equilibrium configurations (& dynamics). Security interdependence and correlated risk can be modeled jointly $[D \text{ dependent on both security choices } \mathbf{s} \text{ and realizations } \mathbf{x}.]$

Defense function *D* for node *i*

$$p_i = D(s_i, \mathbf{s}, G, \mathbf{x}, \dots)$$

- **s** vector of security investments: $\mathbf{s} = s_i \cup \mathbf{s}_{j \neq i}$
- G network topology
- p_i probability of loss for node i

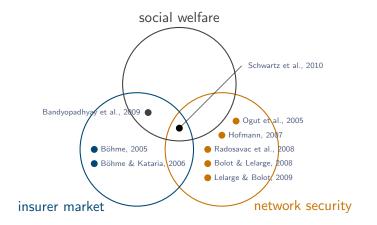
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Dependent Variables

in the Cyber-Insurance Literature



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Cyber-insurers will improve information about security

... but relevant parameters are not included in models.

Cyber-insurers will positively affect (i) agents' security decisions (ii) the network environment

... but existing models of contracts do not reflect that; ... real cyber-insurers do not condition premiums on security.

Broad adoption of cyber-insurance will change (i) insurer market structure(s) and (ii) behavior of ICT manufacturers

... but never modeled parametrically.

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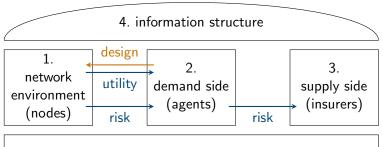
Future papers should model (i.e., endogenize) key parameters of: network environment, etc.

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Example:

endogenous network formation [model of platform switching]





5. organizational environment

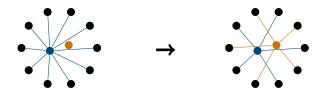
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Future papers should model (i.e., endogenize) key parameters of: network environment, etc.

Example:

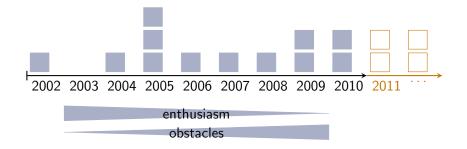
endogenous network formation [model of platform switching]



Policy recommendations should be justified by formal (game theory) models.

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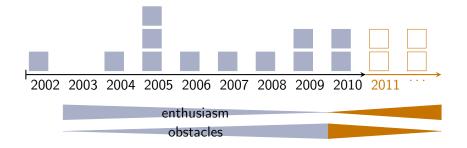
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Thank you for your attention.

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