



# CYBER-INSURANCE AND SECURITY INTERDEPENDENCE: FRIENDS OR FOES?

Authors: Ganbayar Uuganbayar, Artsiom Yautsiukhin, and Fabio Martinelli

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# Presentation outline



□ Introduction



□ Motivation and goals



□ Main contribution

- Analysis
- Initial result



□ Conclusion, Discussion and Future plans





# Introduction



- ❑ Cyber insurance is more than just a financial instrument to smooth the losses
    - **Indicator** (premium) for quality of protection
    - Lead to new and more advanced **standards** in cyber security
    - An incentive to increase **self-protection** and **social welfare**.
  
  - ❑ In fact, the real impact of cyber insurance on self-protection investments is unclear.
    - Correct security modelling is not straightforward.
    - Scarcity of data to validate the models.
    - Authors contradict each other ([1],[2] vs. [3],[4]).
  
  - ❑ Cyber security is (highly) interdependent.
    - Security interdependency decreases self-investments.
1. H.Ogut, N.Menon, S.Raghunathan: **Cyber insurance and its security investment: Impact of interdependent risk.**
  2. G. Schwartz and S. Sastry: **Cyber-insurance Framework for Large Scale Interdependent Networks**
  3. PwC: **Managing cyber risks in an interconnected world**
  4. J.-C. Bolot and M. Lelarge: **A New Perspective on Internet Security using Insurance**



# Motivation and goal



- But, interdependency affect self-investments in both cases:
  - if insurance **is** available
  - If it is **not** available



	Insurance available	No-insurance available
No (low) security interdependence ( $\Pi=1$ )	$x_{LI}^{IA}$	$x_{LI}^{NA}$
High security interdependence ( $\Pi<1$ )	$x_{HI}^{IA}$	$x_{HI}^{NA}$

Assume that

<

V

V

?

We know that

We would like to know

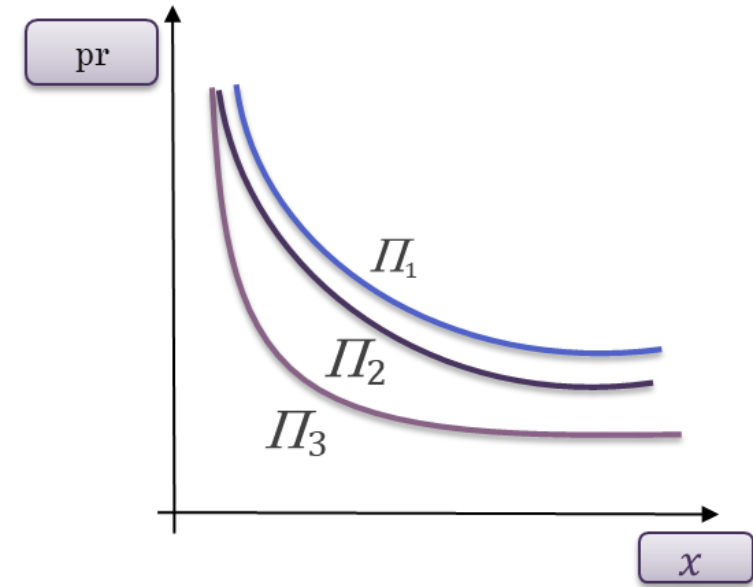


# Security investments and interdependence



- ❑  $x$  - Self-protection,
- ❑  $\pi(x)$  Direct probability of attack ,
  - Direct attack – it affects to someone directly from attacker
  - Indirect attack – it affects to someone through someone
  - $0 < \pi(x^N) < 1$
  - $\pi'(x^N) < 0$
  - $\pi''(x^N) > 0$
- ❑  $\Pi$  - interdependency degree,
- ❑ Probability of an event to occur as  $pr(x; \Pi)$ :

$$pr(x, \Pi) = 1 - (1 - \pi(x))\Pi.$$





# Generic utility function for an agent



- Utility function – satisfaction experienced by the consumer of a good.
  - Risk averse - ( $U' \geq 0; U'' \leq 0$ ) Von Neumann-Morgenstern utility function



- Initially company has  $W$  wealth.



- Expected utility without insurance:

- No incident:** lose investments ( $x$ ) only
- Incident:** lose investments ( $x$ ) and suffer from loss ( $L$ )

$$E[U(W)] = U_{NN} * (1 - pr(x, \Pi)) + U_{NL} * pr(x, \Pi), \text{ where}$$

$$U_{NN} = U(W - x) \text{ if no incident occurs;}$$

$$U_{NL} = U(W - L - x) \text{ if an incident occurs.}$$



- Expected utility with insurance:

- No incident:** lose investments ( $x$ ) and premium ( $pr(x; \Pi) * I$ )
- Incident:** lose investments ( $x$ ), premium and suffer from loss ( $L$ ), but get indemnity  $I$

$$E[U(W)] = U_{IN} * (1 - pr(x, \Pi)) + U_{IL} * pr(x, \Pi); \text{ where}$$

$$U_{IN} = U(W - pr(x, \Pi) * I - x) \text{ if no incident occurs;}$$

$$U_{IL} = U(W - L - pr(x, \Pi) * I + I - x) \text{ if an incident occurs.}$$





# Finding optimal investment



## ❑ No-insurance is available:

- First order condition (FOC) from Expected Utility by self-protection ( $x$ )
- Find optimal investment ( $x^N$ )

$$\pi'(x^N)\Pi = \frac{(1 - (1 - \pi(x^N))\Pi)U'_{NL} + (1 - \pi(x^N))\Pi * U'_{NN}}{(U_{NL} - U_{NN})}$$

## ❑ Insurance is available for an agent:

- FOC for  $l$  as well as for  $x$ .
- The optimal value  $l^* = L \rightarrow$  optimal investment level ( $x^I$ ):

$$\pi'(x^I)\Pi = -\frac{1}{L}.$$



# Comparing the investments



- ❑ We are interested in comparing the investments with the degree of interdependence increases.
  - Without solving complicated equations, we can reason on values of  $x^N$  and  $x^I$
  - If  $\pi'(x^I) > \pi'(x^N)$  investments in case of insurance are higher than in case of no insurance.
- ❑ We would like to know if there is such  $\Pi$ , which makes  $\pi'(x^N) = \pi'(x^I)$ .
  - Outcome of “FOC” in both cases.

$$\pi'(x^N)\Pi = \frac{(1 - (1 - \pi(x^N))\Pi)U'_{NL} + (1 - \pi(x^N))\Pi * U'_{NN}}{(U_{NL} - U_{NN})} = -\frac{1}{L} = \pi'(x^I)\Pi.$$

- $x^N$  depends on  $\Pi$
- $U_{NN}$  and  $U_{NL}$  depend on  $x^N$ .
- ❑ Lets investigate a function  $fn(x^N)$ , defined by the left hand of equation above.





# Analyzing

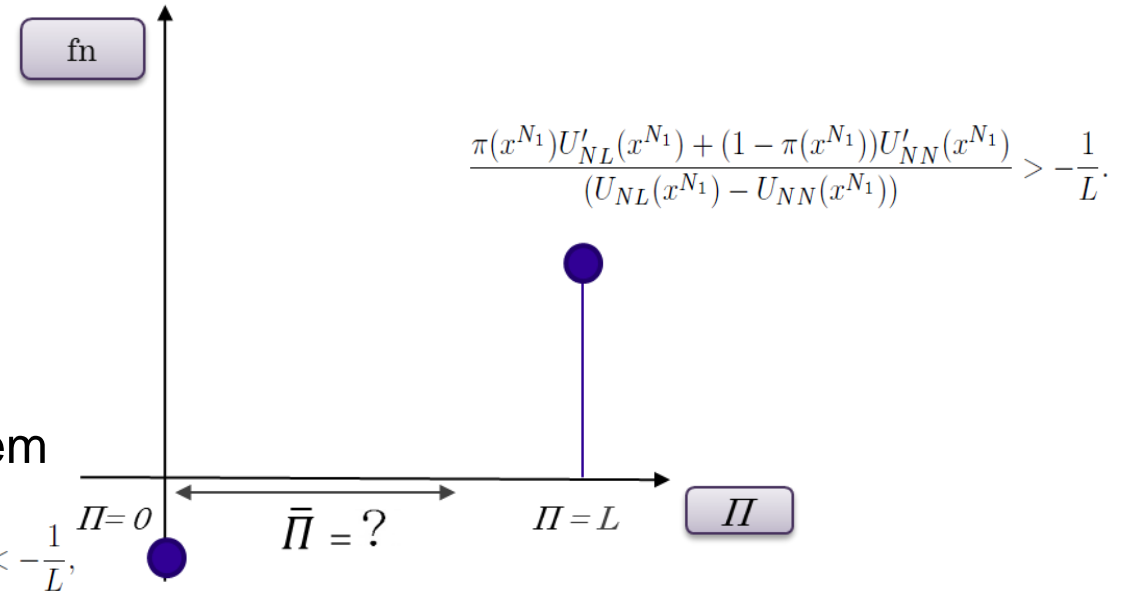


□ Consider two border cases:  $\Pi = 1$  and  $\Pi = 0$ .

□ concave function  $U'_{NL} * L > U_{NN} - U_{NL}$ .

□ function  $fn(\Pi)$  is continuous

□ according to the Intermediate Value Theorem



□ There is such  $1 > \bar{\Pi} > 0$  which makes  $fn(\bar{\Pi}) = -\frac{1}{L}$  :

$$\frac{(1 - (1 - \pi(x^N))\bar{\Pi})U'_{NL} + (1 - \pi(x^N))\bar{\Pi} * U'_{NN}}{(U_{NL} - U_{NN})} = -\frac{1}{L}$$





# Beware of border cases



## □ Pay everything or avoid:

□  $W - L - x^N > 0$  or

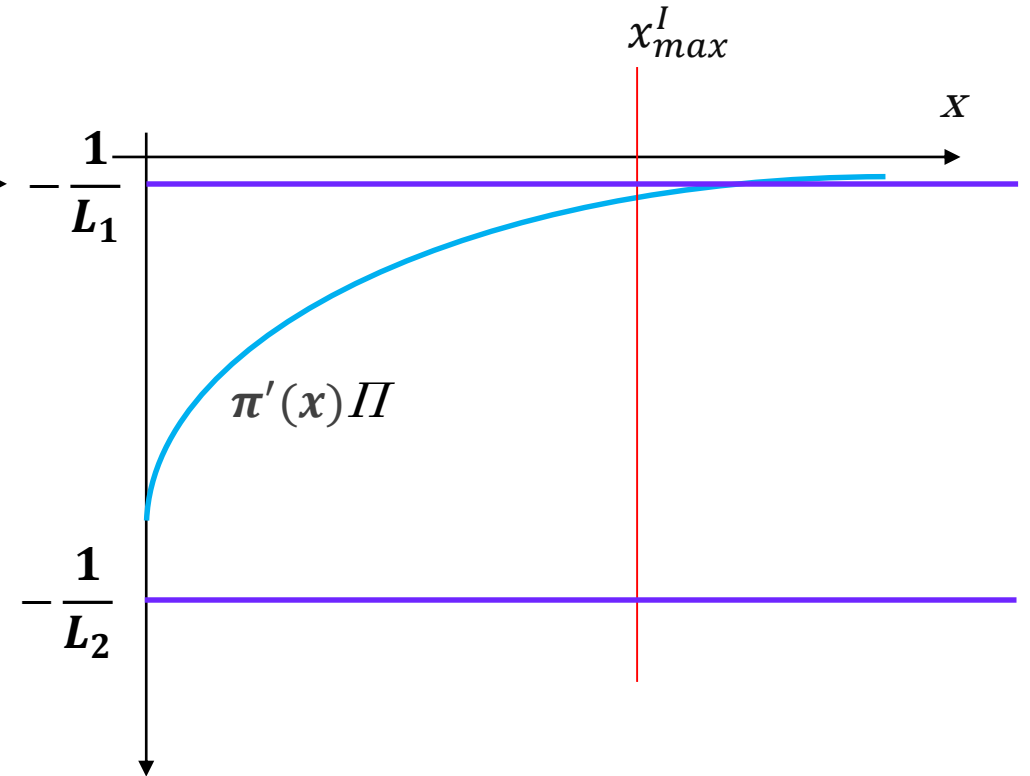
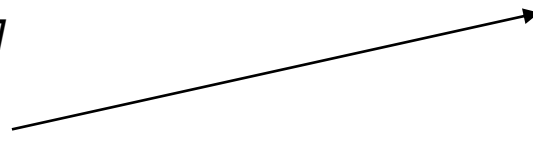
□  $W - pr(x^I, \Pi) * L - x^I > 0$



## □ Pay nothing:

□  $fn(x^N) = \pi'(x^N)\Pi$

□  $-\frac{1}{L_1} = \pi'(x^I)\Pi$





# Conclusion, Discussion, Future work



❑ Interdependent cyber security world has a greater chance to benefit from applying cyber insurance



❑ Beware of border cases



❑ Limitation of this work: what if insurance is incentive for  $\Pi=1$

$$(\pi'(x^I) > \pi'(x^N))?$$



❑ Future work:

○ Find a rigorous answer to the case if insurance is incentive for  $\Pi=1$

$$(\pi'(x^I) > \pi'(x^N))$$

○ Extend the model for several actors (i.e., expand  $\Pi$  and consider the game of agents)

○ Assess effects of information asymmetry, non-competitive market and various regulation mechanisms.





Thanks for the attention.



## *& Questions*

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