

# A Subjective Network Approach for Cybersecurity Risk Assessment

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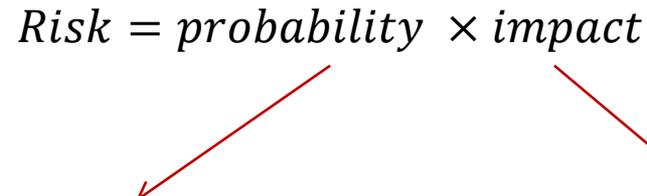
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# Introduction

- Cybersecurity incidents (e.g., cyber-attacks) have been a main problem that faces organizations.
- Security analysts must properly respond to them, and take action to avoid their serious impacts.
- Responding to cybersecurity incidents requires *efficient evaluation* of their risks.

# Limitations in Existing Approaches

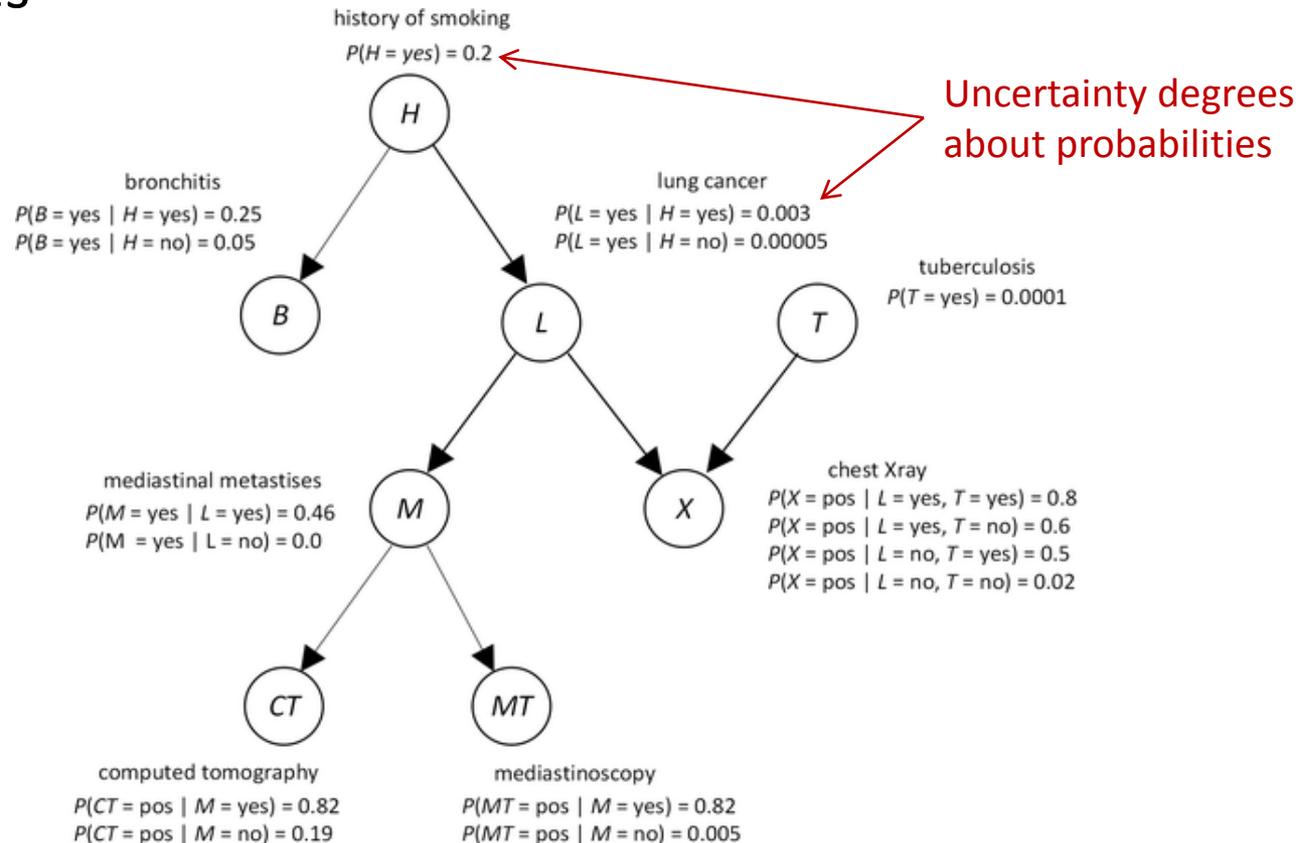
$$\textit{Risk} = \textit{probability} \times \textit{impact}$$
The diagram shows the equation  $\textit{Risk} = \textit{probability} \times \textit{impact}$  at the top. Two red arrows originate from the words 'probability' and 'impact' and point downwards to two separate rounded rectangular boxes. The left box contains three bullet points related to probability, and the right box contains three bullet points related to impact.

- Difficult to elicit accurate probabilities
- Sources of evidence may not be trustworthy
- So, there is uncertainty about probability values

- Impact on what?
- No detailed analysis of the consequences
- No consideration of possible mitigating events

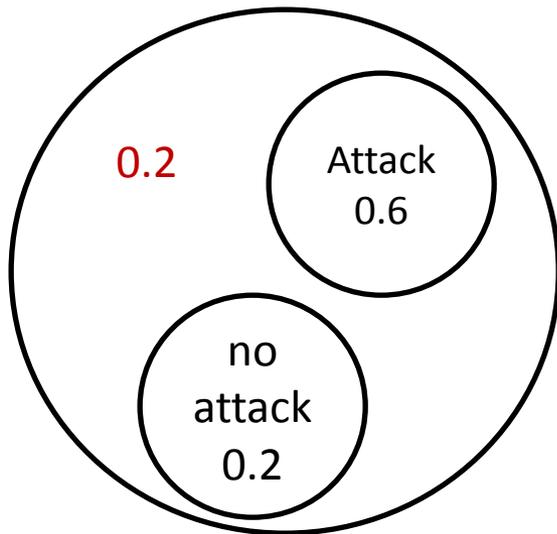
# So, What We Need?

- A cause-effect model (e.g., Bayesian networks)
- Additionally, the model captures *uncertainty* about probabilities

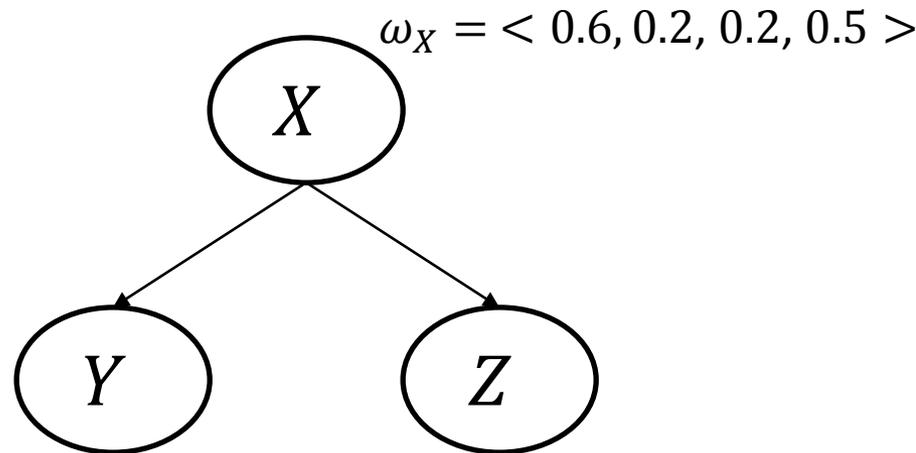


# Subjective Bayesian Networks

- A generalisation of classical BNs.
- Probability distributions associated with the nodes are replaced with *subjective opinions* about them.
- An opinion is a tuple  $\omega_x = \langle b_x, d_x, \mathbf{u}_x, a_x \rangle$ .



$$\omega_{attack} = \langle 0.6, 0.2, 0.2, 0.5 \rangle$$




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COT at node Y

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$$\omega_{Y|x} = \langle 0.7, 0.15, 0.15 \rangle$$

$$\omega_{Y|\bar{x}} = \langle 0.1, 0.85, 0.05 \rangle$$


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COT at node Z

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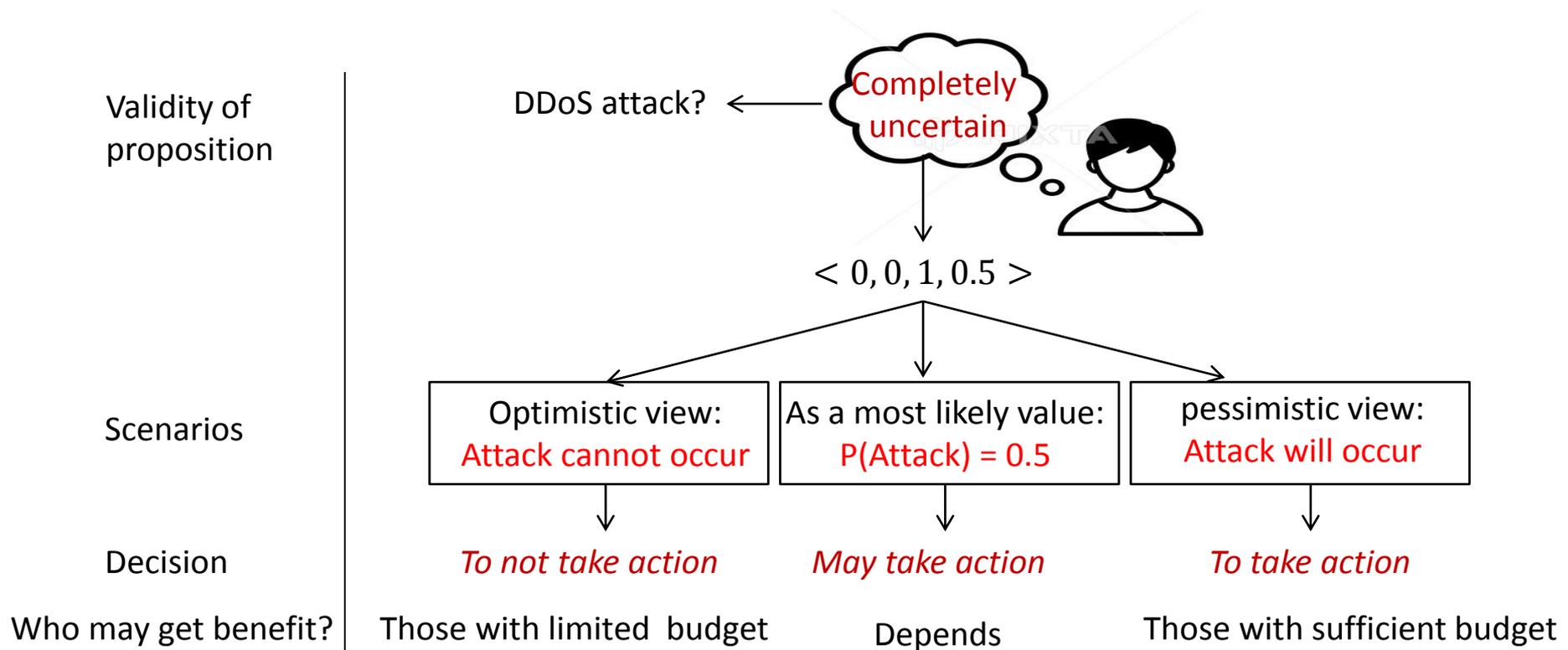
$$\omega_{Z|x} = \langle 0.90, 0.00, 0.10 \rangle$$

$$\omega_{Z|\bar{x}} = \langle 0.20, 0.60, 0.20 \rangle$$

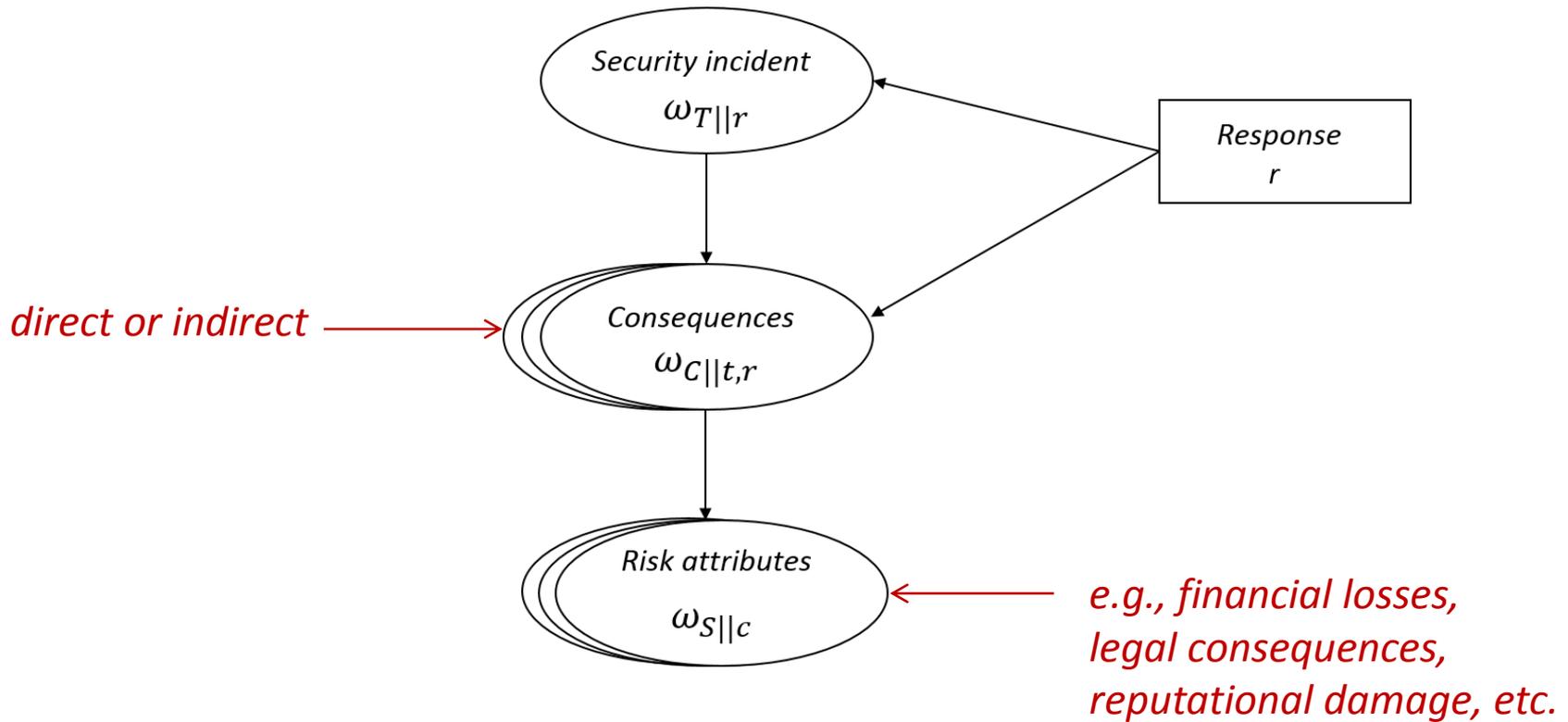

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# Why Should Uncertainty be Modelled?

- Different outcomes, and so different security decisions.
- Flexibility to decision-making process, especially when considering, e.g., risk attitudes or security investment budget.



# SBN Model for Risk Assessment



# Risk Evaluation

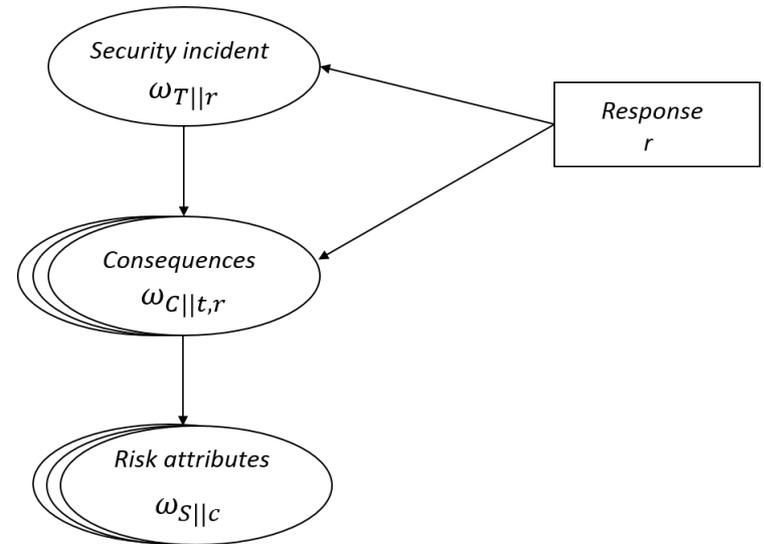
- Potential damage at an attribute node ( $S_j$ ):

$$D_{S_j} = P(S_j) \cdot W_j \cdot V_i(S_j)$$

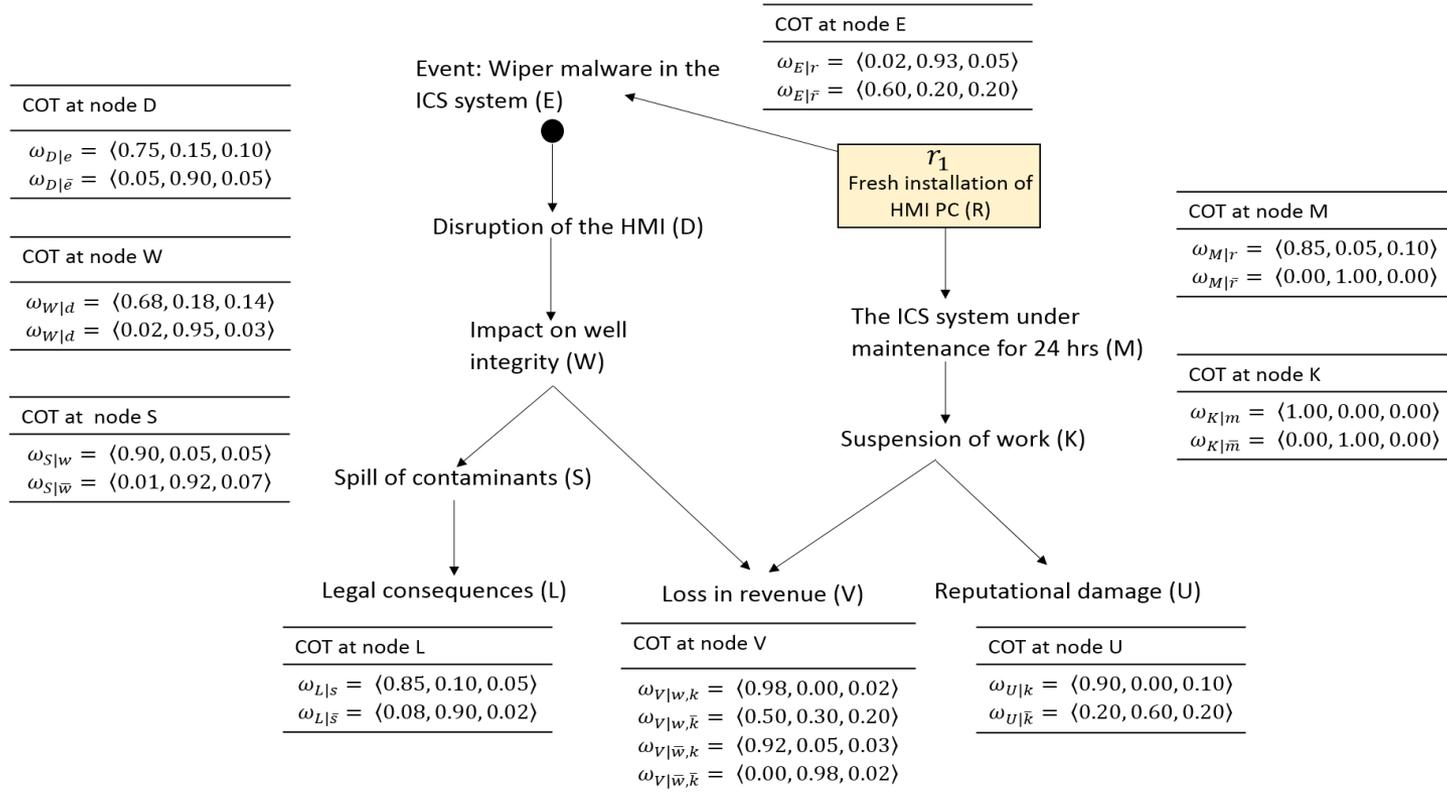
- Risk index:  $RI_r = \sum_{j=1}^n D_{S_j}$ .

- Security Response Effectiveness:

$$SRE(r_j) = \frac{RI_{r_0} - RI_{r_j}}{RI_{r_0}} \times 100,$$



# Example



Risk index with no response	Risk index with $r_1$	Security decision
0.248	0.397	should not enforce $r_1$

# Experimental Results

- We used the scenario of wiper malware.
- We generated three sets of probability values from the opinions (assuming they represent the truth values).
- We used these probabilities and inference approach in BNs to compute risk in the three experiments.
- We compared the results in the two approaches.
- Different outcomes... different decisions.

Approach		Risk index with $r_0$	Risk index with $r_1$	Security decision
SBN approach		0.248	0.397	enforce $r_0$
Probabilistic approach	Exp.1	0.185	0.175	enforce $r_1$
	Exp.2	0.116	0.105	enforce $r_1$
	Exp.3	0.137	0.144	enforce $r_0$

# Conclusions

- A new risk assessment model that takes uncertainty about probabilities into account, using subjective Bayesian networks.
- The model formalises risk as multi-consequence.
- The model offers flexibility to decision-making process.
- The evaluation showed that taking uncertainty about probabilities into account may lead to different outcomes, and therefore different decisions.

# References

- Jøsang, A. (2016). *Subjective logic*. Heidelberg: Springer.
- Jøsang, A., & Kaplan, L. (2016, July). Principles of subjective networks. In *2016 19th International Conference on Information Fusion (FUSION)* (pp. 1292-1299). IEEE.