



# Evidential Reasoning Framework for Trust Services



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## Outline



- Introduction and Objectives
- Evidential Reasoning Framework for Trust Services
- Dempster-Shafer Theory of Belief Functions
- Evidential Diagram
- Decision Theoretic Approach for Cost-Benefit Analysis.
- Conclusion and Discussion



## Evidential Reasoning in Assurance Services

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Definition of Assurance Services: Collection, evaluation, and aggregation of evidence to decide whether the **assertion** on which an opinion is being provided is **true or not true**.

For a Financial Statements audit ...to determine whether the **Financial Statements are fairly stated**.



## Introduction

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- The main purposes of this paper:
  - To provide a **structured framework** for aggregating evidence for making overall judgment about the system's reliability in the context of Trust Services.
    - The framework is based on the evidential reasoning approach of Srivastava (1995) and uses the criteria established by AICPA/CICA for Trust Services to develop the evidential diagram.
  - To develop a **decision theoretical approach** for cost-benefit analysis.



## Introduction (Continued)

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- Companies are now relying heavily on information systems more than ever before.
- It is imperative that IT systems be protected and reliable.
- In response to the growing concerns about reliabilities of systems, AICPA/CICA developed Trust Services, which incorporate “**SysTrust**” and “**WebTrust**” assurance services (AICPA 2003).
  - Five main assertion categories underlying reliable business systems: **Security**; **Availability**; **Processing Integrity**; **Online Privacy**; **Confidentiality**.

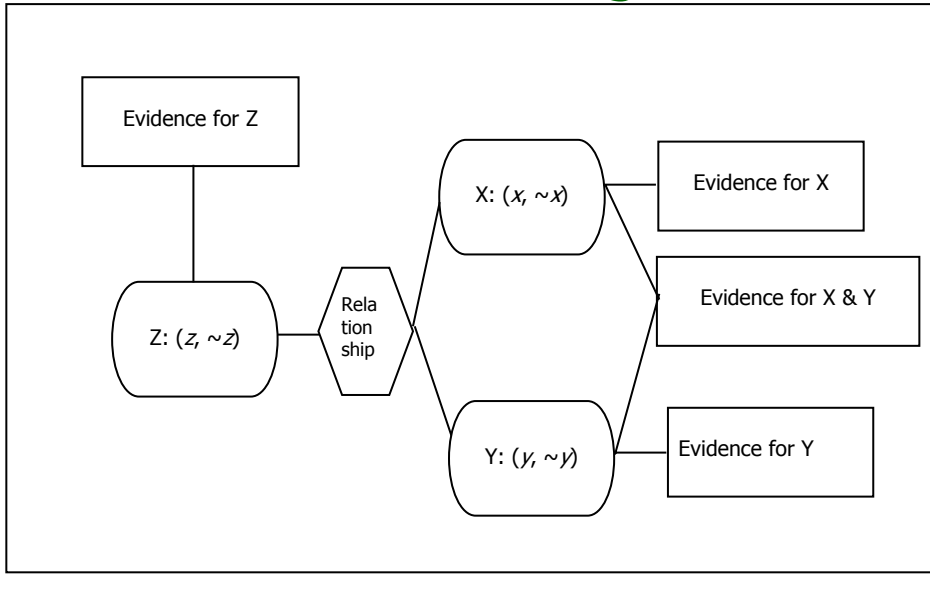


## Introduction (Continued)

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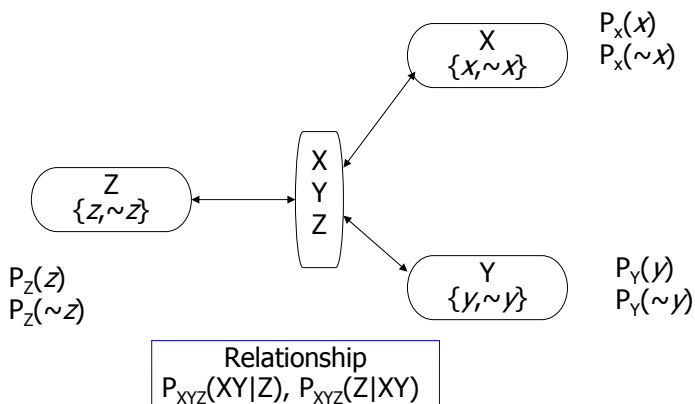
- A company’s information system is a **complex system**.
- The existing methodologies (see. Post and Diltz 1986; Rainer et al. 1991) are **inadequate** in properly incorporating complexities of risk.
- The representing **uncertainties** associated with items of evidence is another problem.
  - Probability theory does not provide a natural and logical way to model uncertainties encountered in the real world.
  - In contrast, Dempster-Shafer theory of belief functions provides a better framework for modeling such uncertainties (see, e.g., Gordon and Shortliffe 1990, Shafer and Srivastava 1990, and Srivastava and Mock 2000).
  - Empirical evidence shows the better performance of belief functions in mapping the uncertainty judgments (Harrison et al 2002; Curley and Golden 1994) .
- The evidential reasoning approach under DS theory of belief functions provides a structured approach for evaluating and aggregating all the evidence gathered in the process.

# An Evidential Diagram



# Evidential Reasoning in Probability

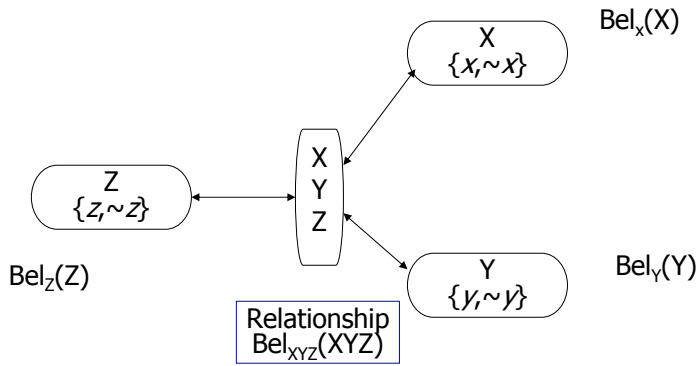
Propagation of uncertainty through a Network





## Evidential Reasoning in Belief Functions

Propagation of uncertainty through a Network



## Evidential Reasoning Framework for Trust Services

- Five steps in developing and using the evidential reasoning approach for Trust Services:
  - Step 1: **Identify assertions** and sub-assertions for the engagement.
  - Step 2: **Connect these assertions and sub-assertions** through logical relationships such as “and”, “or” as appropriate.
  - Step 3: **Identify items of evidence** pertaining to specific assertions and sub-assertions identified in Step 1 and link them to the corresponding assertions and sub-assertions.
  - Step 4: **Collect and evaluate** various items of evidence identified in Step 3 and express these evaluations in terms of belief functions.
  - Step 5: **Aggregate all the items of evidence** using Dempster’s rule of combination to obtain the overall belief that the assertion is met or not met.



# Problems with Probability Framework: An Example

## 1. Problems with interpreting risks as probability numbers:

SAS 47:  $AR = IR.CR.APR.DR$

Consider the following situations:

(i) If the auditor does not want to depend on the inherent factors, the profession suggests to set  $IR = 1$ .

What does this mean in probability theory?  $P(E) = 1$

(ii) If the auditor wants to depend on the inherent risk factors, which are favorable but not very strong, the profession suggests to set  $IR$  to a lower value, say,  $IR = 0.8$ .

What does this mean in probability theory?  $P(E)=.8, P(\sim E)=.2$

iii) The auditor feels that inherent factors are really strong and positive then the profession suggests to reduce  $IR$  further, say,  $IR = 0.5$ .

What does this mean in probability theory?  $P(E)=.5, P(\sim E)=.5$



# Probability versus Belief Functions

## ■ Probability Framework:

$$\text{Frame} = \Theta = \{a_1, a_2, a_3\},$$

$$P(a_i) \geq 0$$

$$P(a_1) + P(a_2) + P(a_3) = 1,$$

$$\text{Also, } P(A) + P(\sim A) = 1.$$

## ■ Belief Function Framework:

$$\text{Belief Mass: } m(a_i), m(\{a_i, a_j\}), m(\{a_1, a_2, a_3\}) \geq 0,$$

$$\sum_{A \subseteq \Theta} m(A) = 1.$$

$m(\cdot)$  represents the belief mass distribution function over the superset of the frame  $\Theta$ . We refer to this function as the *basic belief assignment function*.



## Belief Functions-Axioms

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Axioms: If  $\Theta$  is a frame of discernment, then a function  $\text{Bel}: 2^\Theta \rightarrow [0, 1]$  is a belief function if and only if it satisfies the following conditions:

- (1)  $\text{Bel}(\emptyset) = 0$ .
- (2)  $\text{Bel}(\Theta) = 1$ .
- (3) For every positive integer  $n$  and every collection  $A_1, \dots, A_n$  of subsets of  $\Theta$ ,  
$$\text{Bel}(A_1 \cup \dots \cup A_n) \geq \sum_{I \subseteq \{1, \dots, n\}} (-1)^{|I|+1} \text{Bel}(\bigcap_{i \in I} A_i).$$



## Belief Functions and Plausibility Functions

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$$\text{Bel}(A) = \sum_{B \subseteq A} m(B)$$

$$\text{Pl}(A) = \sum_{A \cap B \neq \emptyset} m(B) = 1 - \text{Bel}(\sim A)$$



# Simple Example

## Analytical Procedure:

$$m(a) = 0.3, m(\sim a) = 0, m(\{a, \sim a\}) = 0.7$$

Based on the above evidence:

$$\text{Bel}(a) = 0.3,$$

$$\text{Bel}(\sim a) = 0,$$

$$\text{Pl}(a) = 1.0,$$

$$\text{Pl}(\sim a) = 0.7,$$

Plausibility that material errors are present defines the risk (Analytical Procedure Risk)



# Complex Example: Belief Functions and Plausibility Functions

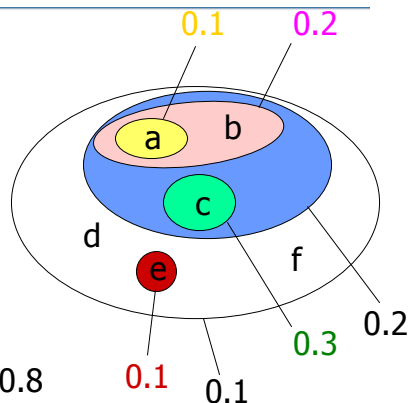
$$\text{Bel}(A) = \sum_{B \subseteq A} m(B)$$

$$\begin{aligned} m(a) &= .1, m(\{a,b\}) = 0.2, \\ m(c) &= 0.3, m(\{a,b,c\}) = 0.2 \\ m(e) &= 0.1, m(\{a,b,c,d,e,f\}) = 0.1 \end{aligned}$$

$$\begin{aligned} \text{Bel}(\{a,b,c\}) &= m(a) + m(\{a,b\}) \\ &\quad + m(c) + m(\{a,b,c\}) \\ &= 0.1 + 0.2 + 0.3 + 0.2 = 0.8 \end{aligned}$$

$$\text{Pl}(A) = \sum_{A \cap B \neq \emptyset} m(B) = 1 - \text{Bel}(\sim A)$$

$$\begin{aligned} \text{Pl}(\{a,b\}) &= m(a) + m(\{a,b\}) + m(\{a,b,c\}) + m(\{a,b,c,d,e,f\}) \\ &= 0.1 + 0.2 + 0.2 + 0.1 = 0.6 \end{aligned}$$





# Security: Objectives and Sub-objectives

## 1.1. Protection against unauthorized logical access

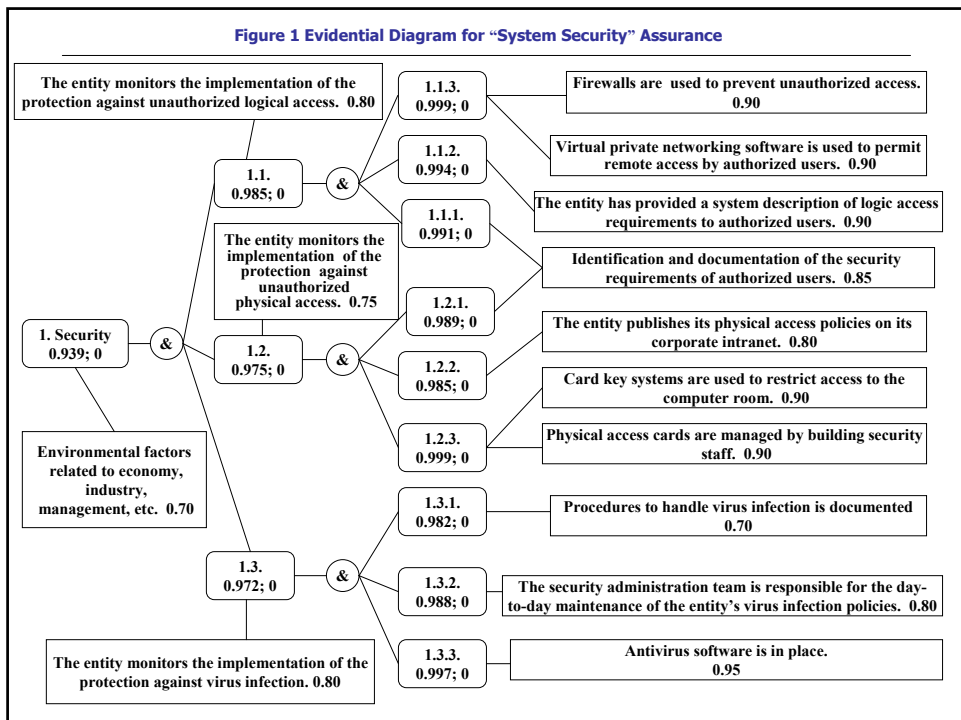
- Policies exist to ensure systems are protected against unauthorized logical access.
- System security policies pertaining to logical access are communicated to authorized users.
- Procedures exist to protect against unauthorized logical access.

## 1.2. Protection against unauthorized physical access

- Policies exist to ensure systems are protected against unauthorized physical access.
- System security policies pertaining to physical access are communicated to authorized users.
- Procedures exist to protect against unauthorized physical access.

## 1.3. Protection against infection by computer viruses

- Policies exist to ensure systems are protected against virus infection.
- System security policies pertaining to virus infection are communicated to authorized users.
- Procedures exist to protect against virus infection.





## Decision Theoretical Approach for Cost-Benefit Analysis

- The management will buy the assurance service when:

$$F + \sum_{i=1}^5 m'_A(\sim a_i)L_i \leq \sum_{i=1}^5 m'_{NA}(\sim a_i)L_i$$

- For the most conservative case ( $\rho = 0$ ), the management will buy the assurance service when:

$$F + \sum_{i=1}^5 \{1 - m_A(a_i)\}L_i \leq \sum_{i=1}^5 \{1 - m_{NA}(a_i)\}L_i$$

or

$$F \leq \sum_{i=1}^5 \{m_A(a_i) - m_{NA}(a_i)\}L_i$$



## Decision Theoretical Approach for Cost-Benefit Analysis

- The break-even dollar amount for a company to obtain the assurance service is determined by:
  - The management's own beliefs on its system reliability in terms of the five principles before obtaining the assurance service;
  - The management's own beliefs on its system reliability in terms of the five principles after obtaining the assurance service;
  - The degree of loss associated with each principle if it is not met;
  - Management's attitude towards resolving the ambiguity ( $\rho$ );
  - The audit fee for the assurance service.



## Conclusion and Discussion

- The approach proposed in the paper
  - uses Dempster-Shafer theory of belief functions for modeling uncertainties associated with the evidence gathered in the process.
  - allows the decision makers to incorporate relevant relationships and interdependencies among assertions and items of evidence.
- The cost-benefit analysis shows
  - the break-even point for a company to obtain the Trust Service.
  - the factors influencing a company's purchase decision of the assurance services.
- Future research
  - Develop an analytical model of the assurance services
  - Empirical work is needed to demonstrate the value of evidential reasoning approach to Trust Services.

## Prior Publications & Applications

- **Financial Statement Assurance:** Srivastava, R. and G. Shafer. 1992. Belief-Function Formulas for Audit Risk. *The Accounting Review*.
- **Risk of Impaired Independence:** Turner, J., T. Mock, and R. Srivastava. 2002. A Formal Model of Auditor Independence Risk. *Australian Accounting Review*.
- **WebTrust Assurance:** Mock, T. and R. Srivastava. 2000. Evidential Reasoning for WebTrust Assurance Services, *Journal of Management Information Systems*.
- **Fraud Risk Assessment:** Mock, T., J. Turner & R. Srivastava. 2002. A Conceptual Framework and Case Studies on Audit Planning and Evaluation Given the Potential for Fraud. *Deloitte & Touche /University of Kansas Symposium On Auditing Problems*.
- **Health Care Audit:** Srivastava, R. P., S. K. Dutta, and R. Johns. 1996. An Expert System Approach to Audit Planning and Evaluation in the Belief-Function Framework. *International Journal of Intelligent Systems in Accounting, Finance and Management*.
- **Information Quality:** Bovee, M, R. P. Srivastava, and B. Mak. 2003. A Conceptual Framework and Belief-Function Approach to Assessing Overall Information Quality. *International Journal of Intelligent Systems*.
- **Causal Mapping:** Srivastava, Buche & Roberts. 2004. Belief Function .. in Causal Maps. In *Causal Mapping for Information Systems and Technology Research: Approaches, Advances and Illustrations* (Forthcoming).



## Current Research Applications

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- Risk of Impaired Independence: Turner, J., T. Mock, and R. Srivastava. 2004. *A Model for Assessing the Risk of Impaired Auditor Independence*.
- Fraud Risk Assessment: Srivastava, R., T. Mock & J. Turner. 2004. *A Comprehensive Model of Financial Statement Fraud Risk*
- Audit Risk assessment: Srivastava, R., J. Turner & T. Mock. 2004. *The Evolution of Audit Risk: Integrating Fraud Risk into the Audit Risk Model*
- Information System Security Assurance: Sun, L., R. Srivastava & T. Mock. 2004. *Risk Analysis of Information Systems Security: An Evidential Reasoning Approach*
- SysTrust Assurance Services: Chan Li and R. Srivastava
- Assurance on the Internal Control over Financial Reporting [SOX 404]: Research proposal by Sun, L., R. Srivastava & T. Mock.



## Other Applications

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- Value Judgment (Srivastava, *Research in Accounting Ethics*, Vol. 2, 1996, pp. 109-130 )
- Decision Making under Ambiguity (Srivastava, *Archives of Control Sciences*, Vol. 6 (XLII), 1997, No. 1-2, pp. 5-27

Papers on belief functions are available from the following website:

<http://www.eycarat.ku.edu/CARAT/research/belief.htm>



Thank You!

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