

# WEB SECURITY

## UNIT - III

### Outline:

#### Database Security:

- Recent Advances in Access Control
- Access Control Models for XML
- Database Issues in Trust Management and Trust Negotiation
- Security in Data Warehouses and OLAP Systems

### 3. Database Issues in Trust Management and Trust Negotiation

#### 3.1 Introduction to Trust Management

- **Authorization** is a central issue in:
  - Computer security
  - Privacy protection
  - Achieving confidentiality, integrity, and availability
- **Traditional authorization:**
  - Based on **pre-established trust relationships**
  - Used within a single organization
  - Relies on identities (login names, passwords, PKI identities)
  - Example: enterprise authorizes employees after authentication
- **Cross-organizational and open environments:**
  - No prior trust relationships
  - Manual approaches (local accounts, X.509 lists) are:
    - Administratively expensive
    - Unscalable
    - Unmanageable for dynamic relationships
- **Ad hoc authorization scenarios:**
  - Senior citizen discounts
  - Family/friends accessing photo albums
  - Requirements unrelated to organizational affiliation
  - Identity-based approaches fail
- **Emergence of Trust Management (TM):**
  - Enables **on-the-fly trust establishment**
  - Authorization based on attributes instead of identity
  - Key early contributions:
    - Bina et al.: attribute-based authorization using certificates
    - Blaze et al.: delegation-based authorization; coined *trust management*
    - SPKI (Ellison et al.)
    - SDSI (Rivest et al.): naming and key binding
- **Digital credentials in TM:**
  - Cryptographically signed
  - Convey authorization-relevant information

- Used to determine compliance with access control policies
- **Two additional challenges:**
  1. **Credential discovery:**
    - Credentials issued and stored in a decentralized manner
  2. **Credential and policy sensitivity:**
    - Credentials may contain confidential information
    - Policies may leak sensitive facts
    - Policies themselves require access control
- **Trust negotiation:**
  - Automated, bilateral trust establishment
  - Parties exchange credentials and policies incrementally
  - Supports main authorization decision plus secondary ones
  - Based on credentials
- **Relation to databases:**
  - Many TM systems based on **Datalog**
  - Authorization = query evaluation over distributed data
  - Credential and policy storage resembles distributed databases
- **Scope of the chapter:**
  - Focuses on **authorization-based trust management**
  - Not reputation or trustworthiness estimation systems
- **Chapter structure:**
  - Section 2: What is Trust Management
  - Section 3: History and systems
  - Section 4: Evaluation problems
  - Section 5: Trust negotiation
  - Section 6: Open issues and trends

### 3.2 What is Trust Management?

- **Traditional access control:**
  - Identity-based (ACLs, PKI)
  - Closed environments
  - All authorized identities known in advance
- **Decentralized environments:**
  - Unknown clients and peers
  - ACLs exclude legitimate users
  - Peer-to-peer systems require mutual trust
- **Trust Management approach:**
  - Delegation of authority
  - Resource owners rely on external authorities
  - Supports decentralized authorization
- **Digital credentials:**
  - Signed using public key cryptography
  - Verifiable by anyone with issuer's public key
  - X.509v3 is common, but alternatives exist

- Can include attributes (employee ID, license, age)
- **Monotonic authorization semantics:**
  - Adding credentials cannot revoke authorization
  - No negative evidence
  - Fail-safe behavior
  - Important in decentralized systems with incomplete information
- **Certificates vs credentials:**
  - PKI certificates bind keys to identities
  - TM credentials bind keys to **authorization-relevant attributes**
- **Capability-based roots:**
  - PolicyMaker and KeyNote resemble capabilities
  - Credentials grant specific access rights
  - Delegation chains prove authorization
- **Credential chains:**
  - Series of signed delegations
  - Each signed using previous key
  - Requester proves possession of final key
- **Attribute-based credentials:**
  - Used in later systems (SPKI/SDSI, RT, Cassandra)
  - Describe properties (student, citizen, age)
  - Enable scalable policies
- **Delegation idioms:**
  - **Delegation:** passing access rights
  - **Appointment:** granting attributes not possessed by appointer
  - **Threshold delegation (k-out-of-n):**
    - Authority effective only with cooperation of k entities
- **Compliance checking (authorization query evaluation):**
  - Determines if credentials satisfy policy
  - Requires credential chain discovery
  - Can be represented as paths in a credential graph
- **Trust negotiation:**
  - Runtime bilateral trust establishment
  - Credentials + explicit policies
  - Automated protocols

**Fig. 1. Example trust negotiation**

- Scenario: Alice purchases prescription medication from Bob's pharmacy
- Steps illustrated:
  - Bob discloses sales policy
  - Alice requests proof Bob is licensed pharmacist
  - Bob presents pharmacist credential
  - Alice verifies and sends prescription
  - Alice provides doctor license credential
  - Bob verifies prescription and patient identity
  - Access granted

- Demonstrates:
  - Mutual disclosure
  - Credential discovery
  - Privacy-preserving trust establishment
  - Automation via software agents

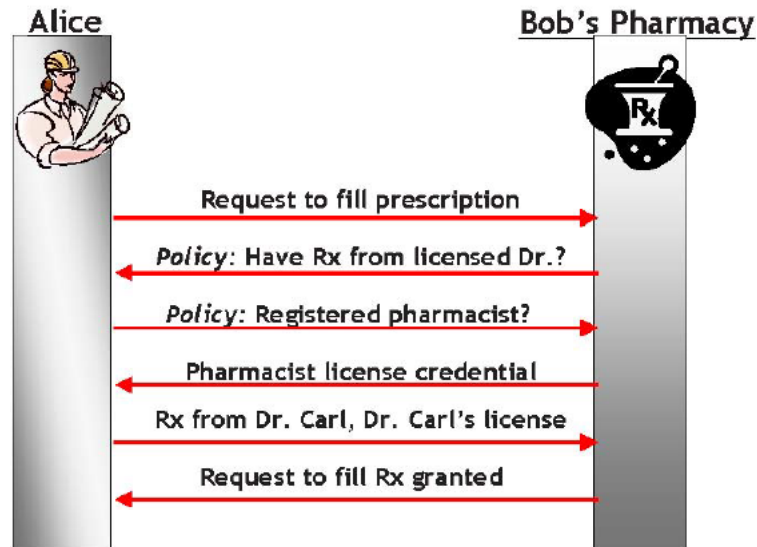


Fig. 1. Example trust negotiation

### 3.3 History

- Surveys major trust management systems
- Focuses on:
  - Features
  - Contributions
  - Intended applications

#### 3.3.1 PolicyMaker and KeyNote

##### PolicyMaker

- First trust management system
- Proof-of-concept
- Assertions are programmable:
  - <Source> ASSERTS <AuthorityStruct> WHERE <Filter>
- Application-dependent semantics
- Does not perform cryptographic verification

##### KeyNote

- Successor to PolicyMaker
- Uses a fixed, human-readable assertion language
- Enforces cryptographic signature verification
- Binds public keys to authorizations
- Uses **action environment** (name–value bindings)

### Fig. 2. An example KeyNote assertion

- Shows:
  - Authorizer public key
  - Licensees
  - Conditions on file and access type
  - Signature
- Demonstrates delegation and read access control

```
KeyNote-Version: 1
Authorizer: rsa-pkcs1-hex: "1234abcd"
Licensee: dsa-hex: "9876dcba" || rsa-pkcs1-hex: "6789defg"
Comment: Authorizer delegates read access to either of the licensees
Condition: ($file == "/etc/passwd" && $access == "read") → {return "OK"}
Signature: rsa-md5-pkcs1-hex: "f00f5673"
```

Fig. 2. An example KeyNote assertion.

### 3.3.2 SPKI/SDSI

- Combines:
  - SDSI: naming infrastructure
  - SPKI: authorization certificates

#### SDSI Contributions

- **Local and extended names**
- Names bound to keys
- Avoids global naming conflicts
- Supports groups via name resolution

#### SPKI Contributions

- Authorization certificates:
  - Issuer
  - Subject (key or SDSI name)
  - Delegation bit
  - Authorization tag
- Enables dynamic group-based authorization

### 3.3 QCM and SD3

#### QCM (Query Certificate Manager)

- Designed for distributed data security
- Introduced **policy-directed certificate retrieval**
- Uses query decomposition and optimization

#### SD3

- Successor to QCM
- Verifies cryptographic signatures
- Supports distributed credential retrieval
- Uses extended Datalog with SDSI names
- Implements certified evaluations

### 3.3.4 RT

- Family of **Role-based Trust Management languages**
- Combines RBAC and TM
- Based on Datalog
- Supports:
  - Efficient query evaluation
  - Role hierarchies
  - Delegation
  - Constraints
- Credential types:
  - Simple Member
  - Simple Inclusion
  - Linking Inclusion
  - Intersection Inclusion
- Formal Datalog translation defines semantics
- Supports extensions: RT1, RT2, RTC, RTT, RTD
- **Application Domain Specification Documents (ADSDs):**
  - Define role vocabulary
  - Ensure consistent semantics
  - Identified by URIs

### 3.3.5 OASIS and Cassandra

- Both are role-based TM systems

#### OASIS

- Introduced **appointment**
- Supports sessions
- Uses first-order logic

#### Cassandra

- Designed for electronic health records
- Uses Datalog with constraints
- Supports sessions and trust negotiation
- Uses predefined predicates for permissions and role activation

**Fig. 3. The PCA system**

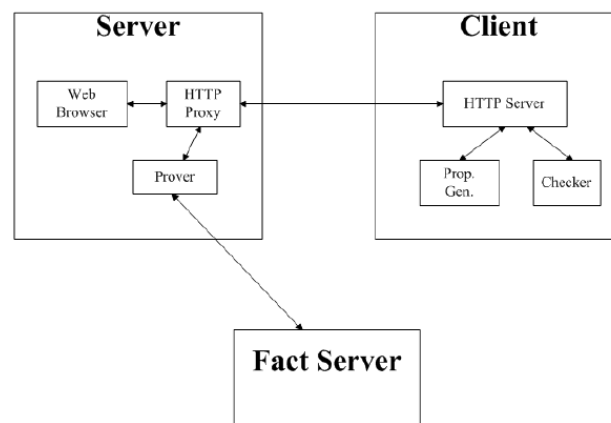


Fig. 3. The PCA system

- Shows:
  - Client proxy
  - Server
  - Proof generation on client side
  - Proof checking on server side

### 3.3.6 PCA

- **Proof Carrying Authorization**
- Designed for web services
- Client constructs proof
- Server checks proof
- Uses higher-order logic
- Avoids undecidable computation on server

### Fig. 4. An example TPL rule

- Shows:
  - XML-based rule
  - Prolog translation
- Demonstrates rule portability and logic-based interpretation

XML:

```
< GROUP NAME = "Hospitals" >
  < RULE >
    < INCLUSION ID = "reco"   TYPE = "Recommendation"
      FROM = "self" >< \INCLUSION >
    < \RULE >
  < \GROUP >
```

Prolog:

```
group(X,Hospitals)    :    -    cert(Y,X,"Recommendation",RecFields),
group(Y,self).
```

Fig. 4. An example TPL rule shown in its concrete XML syntax and its internal Prolog representation.

### 3.3.7 TPL

- Trust Policy Language
- Designed for strangers
- Maps users to roles
- Uses XML syntax
- Certificate-format independent
- Supports non-monotonic policies
- Uses credential collectors for negative credentials

## 3.4 Evaluation Problems and Strategies

- Key issues:
  1. Separation of authorization from applications
  2. Special-purpose policy languages

- 3. Credential discovery and retrieval
- Credential storage is decentralized
- Evaluation can be:
  - Distributed
  - Centralized with remote retrieval

### 3.4.1 General-Purpose Query Evaluation Engine

- Introduced by PolicyMaker
- Advantages:
  - Reusability
  - High assurance
  - Formal correctness
- Separates application logic from authorization logic

### 3.4.2 Efficiency and Expressivity

- PolicyMaker:
  - Highly expressive
  - Undecidable compliance checking
- LBPOC (Locally Bounded Proof of Compliance):
  - Polynomial restrictions
  - Bounded execution resources
- Declarative approaches preferred:
  - SPKI/SDSI: polynomial-time closure
  - KeyNote: monotonic but undecidable authorization set
  - SD3 and RT: Datalog-based
  - Cassandra: constraint-based with groundness analysis
  - PCA: requester constructs proof
  - LolliMon: higher-order linear logic

### 3.4.3 Credential Retrieval Mechanisms

- Early systems assumed all credentials provided
- Modern systems support **automatic credential discovery**
- Avoids duplication of effort
- TM engine assists in:
  - Identifying missing credentials
  - Retrieving them
- Two approaches:
  1. Remote evaluation via queries (QCM, SD3)
  2. Remote credential fetching (RT)

### Fig. 5. QCM system

- Illustrates:
  - Distributed credential repositories
  - Policy-directed retrieval
  - Cooperative TM engines



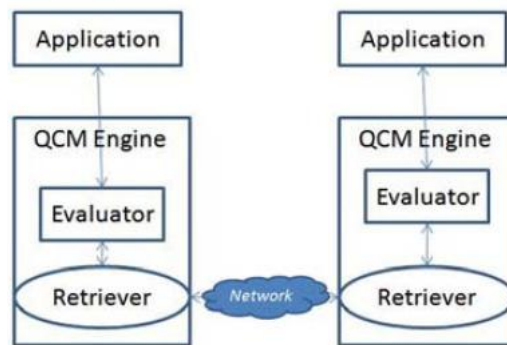


Fig. 5. QCM system

### 3.4.4 Distributed Evaluation

- QCM was the **first trust management (TM) system** to integrate **credential retrieval** directly into the evaluation engine.
- When local credentials are insufficient:
  - Queries are forwarded to **remote TM engines**
  - These engines belong to principals whose assertions may satisfy the query
- **Figure 5** (referenced):
  - Illustrates QCM's distributed architecture
  - Shows query propagation among multiple credential repositories

### QCM Evaluation Modes

- **Verify-only mode:**
  - Credential retrieval disabled
  - Used to verify that returned credentials solve the query
- **Verify-retrieval mode:**
  - Enables remote credential discovery
- Credential retriever:
  - Shares code with the evaluator
  - Does not significantly increase code size

### Types of Remote Replies

- When a remote engine is queried, it may return:
  - **Extensional answers:**
    - Direct reply
    - Table of tuples satisfying the query
    - Often packaged as a newly signed credential
  - **Intensional answers:**
    - Proof
    - Partial proof
    - Set of credentials from which an answer can be deduced
- In **SD3 terminology:**
  - Direct replies → extensional
  - Proof-based replies → intensional
- TM engines returning answers to applications should return **extensional answers** only

### Quality of Service in SD3

- SD3 allows servers to choose response types:
  - **High level:** full evaluation + direct reply
  - **Medium level:** partial proof + hints to other servers
  - **Low level:** locally available credentials only
- Helps prevent:
  - Bottlenecks
  - Denial-of-service attacks

### Integrity and Authenticity of Replies

- Replies are **digitally signed**
- Two signing approaches:
  - **On-line signing:**
    - Server signs answers dynamically
  - **Off-line signing:**
    - Server returns pre-signed credentials
    - Protects private keys
    - Requires synchronization with off-line signer
- Intensional answers:
  - Typically require verification of more signatures
- **QCM optimization:**
  - Uses **hash trees**
  - Reduces signing and verification overhead
- QCM allows servers to choose either signing method

### Cyclic Dependencies in Distributed Evaluation

- Cycles among predicate definitions may cause:
  - Repeated subqueries
  - Nontermination
- Solutions:
  - **QCM:**
    - Uses time-outs to detect cycles
    - Risk: legitimate queries may be denied
  - **SD3:**
    - Tags queries with waiting sites
    - Detects cycles explicitly
    - Costly in bandwidth and processing

### 3.4.5 Local Evaluation with Distributed Credentials

- **QCM and SD3:**
  - Credentials issued, revoked, and stored in a **distributed manner**
  - Credentials stored with **issuers**
  - Ensures discoverability under basic availability assumptions

### Limitations of Issuer-only Credential Storage

- In practice, some credentials should be stored with **subjects**
- Example:

- Student discounts:
  - University issuing credentials may not want to serve every verification request
  - Privacy concerns: student controls disclosure

### RT Approach to Distributed Credentials

- **RT** allows credentials to be stored:
  - With issuers
  - With subjects
- Evaluation is performed **locally**
- Remote servers only provide credentials
- Authorization modeled as a **graph**:
  - Nodes: role expressions
  - Edges: credentials and derived relationships
  - **Chains** = proofs of authorization

### Graph-based Evaluation

- Query: Is  $D$  a member of  $A.r$ ?
- Process:
  - Add nodes for  $D$  and  $A.r$
  - Extend graph using relevant credentials
- Problem:
  - If credentials are not stored by principals named in nodes, they may be undiscoverable

### Example (from [49])

- **Table 1** (referenced):
  - RT<sub>0</sub> credentials describing:
    - EPub discounts
    - University accreditation
    - Student enrollment

(1) FAB.university $\leftarrow$ StateU (2) RegistrarB.student $\leftarrow$ Alice (3) EPub.discount $\leftarrow$ EOrg.preferred (4) EOrg.university $\leftarrow$ FAB.accredited (5) StateU.student $\leftarrow$ RegistrarB.student (6) EOrg.preferred $\leftarrow$ EOrg.university.student
--

Table 1.

- Credential chain:
  - Part (a): EPub.discount  $\leftarrow$  EOrg.preferred  $\leftarrow$  EOrg.university.student
  - Part (b): EOrg.university  $\leftarrow$  FAB.accredited  $\leftarrow$  StateU
  - Part (c): StateU.student  $\leftarrow$  RegistrarB.student  $\leftarrow$  Alice
- Demonstrates necessity of:
  - Storing some credentials with subjects (Alice)
  - Storing others with issuers (EOrg, FAB, RegistrarB)

### **Credential Discovery Problem**

- If credentials are stored arbitrarily:
  - Evaluation may fail even if authorization is valid
- RT solution:
  - **Type system for credentials**
  - Role names assigned types
  - Types indicate where credentials should be stored
- **Well-typing rules:**
  - Ensure all credentials in a chain are discoverable
- Extended from **RT<sub>0</sub>** to **full RT**

### **PeerAccess Solution**

- Uses **brokers, issuers, and subjects**
- Supports **proof hints**
- Brokers act like:
  - Search engines for credentials
- Can encode retrieval strategies of:
  - QCM
  - SD3
  - RT

### **3.5 Automated Trust Negotiation**

- Many algorithms exist for runtime trust establishment
- Examples include:
  - Unipro, Cassandra, Trust- $\gamma$ , PeerAccess, idemix
- Common advantages over identity-based access control:
  - Dynamic bilateral trust
  - Attribute-based authorization
  - No reliance on centralized trusted third parties
  - Gradual disclosure of credentials
  - Possible authorization without revealing exact attributes

### **Policy Language Requirements**

- Well-defined semantics
- **Monotonicity:**
  - Additional credentials should not reduce trust
- Support for:
  - Conjunction, disjunction
  - Transitive closure
  - Attribute constraints
  - Multi-credential constraints (joins)

#### **3.5.1 Supporting Autonomy during Trust Negotiation**

- Parties are autonomous:
  - Free to choose actions and strategies
- Negotiation defined by:
  - **Protocol:** message types and ordering rules

- **Strategy:** local decision-making algorithm

### **Disclosure Strategies**

- Disclose all credentials
- Disclose all relevant credentials
- Disclose minimal credentials:
  - Based on set inclusion
  - Based on weighted sensitivity
- Cryptographic strategies:
  - Prove policy satisfaction without revealing credentials
- Hybrid strategies:
  - Direct disclosure for low sensitivity
  - Cryptographic methods for high sensitivity

### **Strategy Interoperability**

- Parties need only agree on:
  - A **set of interoperable strategies**
- Guarantees:
  - Negotiation succeeds if authorization is possible
  - Preserves autonomy
  - Supports sensitive policies

### **3.5.2 Avoiding Information Leakage during Trust Negotiation**

#### **Leakage Risks**

- Credentials reveal unnecessary attributes
- Behavior reveals possession or absence of credentials
- Attribute values inferred via repeated queries
- **Need-to-know attacks:**
  - Harvest credentials through policy rewriting

#### **Protection Techniques**

- Selective disclosure credentials
- Cryptographic proof systems:
  - Prove properties without revealing values
- Non-response to sensitive queries
- **Acknowledgement policies (ack-policies)**
- Attribute-based requests instead of credential-based
- Ontologies to choose least revealing credentials

#### **Limitations**

- Direct disclosure offers no guarantee against redistribution
- PeerAccess enforces disclosure policy propagation
- P3P policies can be checked, but not enforced
- Most secure solution:
  - Cryptographic TN without direct disclosure

### **3.5.3 Trust Negotiation Implementations**

- Most TN systems are:
  - Proofs of concept

- Not production-ready
- Publicly available systems:
  - TrustBuilder
  - TrustBuilder2
  - Trust- $\chi$

### **TrustBuilder2 Framework**

- Java-based, modular TN framework
- Components:
  - Strategy modules
  - Compliance checkers
  - Query interfaces
  - Audit modules
- **Figure 6:**
  - Shows internal structure of TrustBuilder2 agent
- Supports:
  - Plug-ins
  - Multiple policy languages
  - Multiple credential formats
- Enables controlled experiments and component comparison

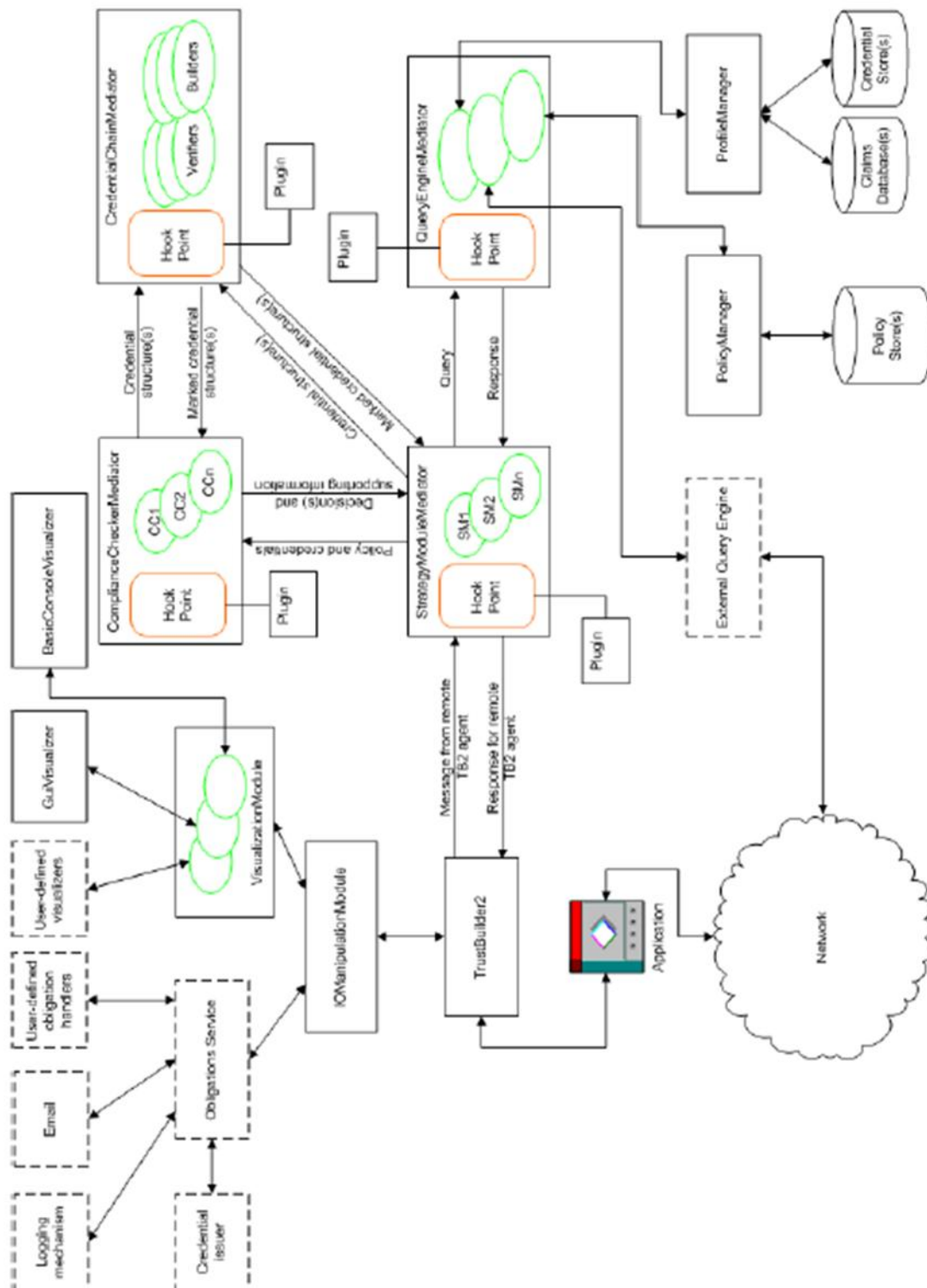
## **3.6 Open Issues and Trends**

### **3.6.1 Policy Engineering and User Interfaces**

- Policy specification is error-prone
- Empirical studies show:
  - Low correctness of user-written policies
- Research needs:
  - Policy debugging tools
  - User-friendly languages
  - Explanation of authorization decisions
  - Policy compilation from high-level abstractions
- Use of **default policies** from credential issuers

### **3.6.2 Real-world Trust Negotiation Deployments**

- TN adoption is limited
- Major challenges:
  - Scalability
  - Security hardening
  - Real-world deployment experience
- Need for small-scale production deployments



**Fig. 6.** Internal structure of a TrustBuilder2 trust negotiation agent

### 3.6.3 Distributed Proof Construction

#### Key Challenges

- **Autonomy:**
  - Parties use different proof strategies
- **Sensitive information:**

- Proof fragments may be confidential
  - Need controlled disclosure
- **Non-monotonicity:**
  - Negative conditions and environmental changes
  - Time- and context-dependent authorizations
- Distributed proof construction remains a **major open research problem**

## 4. Security in Data Warehouses and OLAP Systems

### 4.1 Introduction

- Rapid growth in **computer and network technologies** has enabled organizations to collect, store, and analyze **large volumes of data**.
- **Data warehouses** and **OLAP (On-Line Analytical Processing)** systems are central to organizational decision-making.
- **Security importance:**
  - Leakage of organizational secrets → **financial and competitive damage**
  - Indiscriminate data collection → **privacy violations**
  - Government data warehouse breaches → **high-impact losses (e.g., national security)**

### Unique Security Challenges in OLAP

- OLAP systems primarily support **decision support**, not transactional access.
- They rely heavily on **data aggregation** to:
  - Hide insignificant details
  - Highlight global patterns and trends
- **Data cube model [15]** organizes multidimensional aggregates via **dimension hierarchies**.
- **Primary threat:**
  - **Insiders** with legitimate access using OLAP queries to infer sensitive data.
- Traditional methods are insufficient:
  - **Data sanitization** → vulnerable to **linking attacks**
  - **Access control** → not directly applicable due to **different data models**
  - **Inference control** → computationally expensive and impractical for online OLAP

### Motivation and Chapter Overview

- Aggregation does not fully destroy sensitive information.
- Remaining information + external knowledge → **indirect disclosure**.
- Online inference control is considered impractical due to:
  - High computational cost
  - Continuous tracking of query history
- **Offline inference control** (e.g., census tables) proves inference threats are real.

### Chapter goals:

- Demonstrate inference threats via OLAP queries
- Identify security requirements
- Review:



- Two inference-control extensions for OLAP
  - A **preventing-then-removing** approach
- Show applicability to a broad range of aggregation types

#### Chapter organization:

- Section 2: Background
- Section 3: Inference threats and security requirements
- Section 4: Three-tier security architecture
- Section 5: Inference control methods
- Section 6: Conclusion

## 4.2 Background

### 4.2.1 Data Warehouses and OLAP Systems

#### Data Warehouses

- Centralized repositories storing enterprise data
- Organized using:
  - **Star schema**: fact table + dimension tables
  - **Snowflake schema**: normalized dimension tables
- Data characteristics:
  - Integrated from multiple sources
  - Cleaned and transformed
  - Periodically refreshed (not continuously updated)
- **Data marts**: subsets tailored to specific organizational needs

#### OLAP Systems

- Coined by **Codd et al., 1993 [9]**
- Used for **business data analysis** (sales, healthcare, etc.)
- Key goals:
  - Interactive exploration
  - Multi-perspective analysis
  - Multiple levels of generalization

#### OLAP Architectures

- **ROLAP**: Multidimensional queries → SQL on relational DB
- **MOLAP**: Materialized multidimensional views
- **HOLAP**: Hybrid of ROLAP and MOLAP

#### OLAP vs Data Mining

- Data mining: automatic pattern discovery
- OLAP: human-driven pattern interpretation
- OLAP is more flexible
- Both can be combined for enhanced analysis

#### OLAP Requirements

- Defined via **FASMI test** and **Codd rules**
- Relevant requirements:
  - High query efficiency
  - Pre-computation and indexing
  - Multidimensional generalization via **data cubes**

## Data Cube Model

- Introduced to support **sub-totals and histograms** efficiently
- Avoids complex SQL queries with exponential unions

### Explanation of Figure 1: An Example of Data Cubes

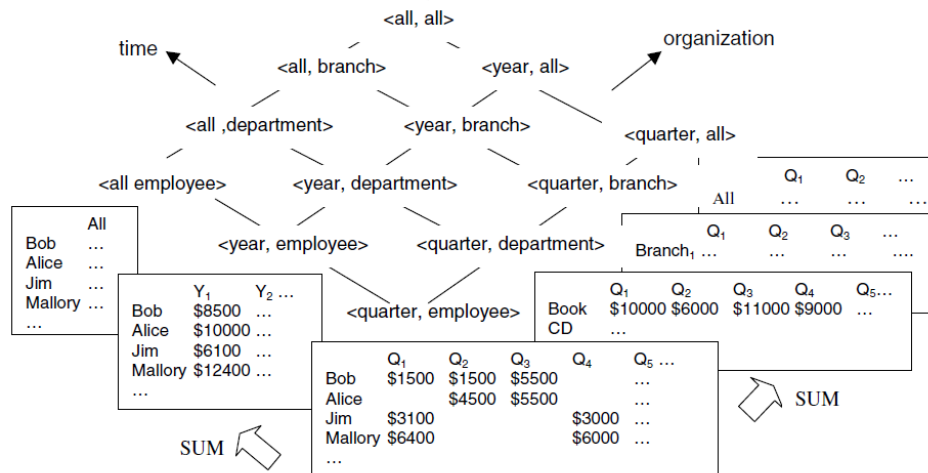


Fig. 1. An Example of Data Cubes

- Dimensions:
  - **Time** (quarter → year → ALL)
  - **Organization** (employee → department → branch → ALL)
- Each dimension forms a **dependency lattice**
- Product of lattices → **cuboid lattice**
- Each cuboid  $\langle T, O \rangle$  is a 2D array of cells  $\langle t, o \rangle$
- Cells also form a dependency lattice

### Cube Population

- Base table schema: (quarter, employee, commission)
- Core cuboid:  $\langle \text{quarter}, \text{employee} \rangle$
- Aggregation function: **SUM**
- Empty cells treated as zero (depending on aggregation)
- Example:
  - Cell  $\langle Y1, \text{Bob} \rangle = \text{sum of } \langle Q1-Q4, \text{Bob} \rangle = 8500$

### 4.2.2 Related Work

- OLAP security is underdeveloped compared to relational DBs
- **Access control models:**
  - DAC, RBAC, FAF
- **Inference control techniques:**
  - Restriction-based (deny unsafe queries)
  - Perturbation-based (add noise)
- **Cell suppression & partitioning:**
  - Effective for 2D tables
  - Intractable for higher dimensions
- **Privacy-preserving data mining:**
  - Uses perturbation

- Not suitable for precise OLAP insights
- **k-anonymity:**
  - Ensures each record indistinguishable from  $k-1$  others
- **Information-theoretic approaches:**
  - Too strict for aggregation-based disclosure

### 4.3 Security Requirements

#### 4.3.1 The Threat of Inferences

- OLAP users can infer sensitive data from legitimate queries
- **1-d inference:** inferred from exactly one descendant
  - *Example 1:*  $\langle Q5, \text{Bob} \rangle$  inferred from  $\langle Q5, \text{Book} \rangle$
- **m-d inference:** inferred from multiple descendants
  - *Example 2:* SUM-based inference using  $\langle \text{year}, \text{employee} \rangle$  and  $\langle \text{quarter}, \text{department} \rangle$
  - *Example 3:* MAX-based inference even without outbound knowledge
  - *Example 4:* Combined SUM, MAX, MIN allows full reconstruction

#### 4.3.2 The Requirements

A practical OLAP security solution must balance:

- **Security:** Prevent unauthorized access and indirect inference
- **Applicability:** Avoid unrealistic assumptions
- **Efficiency:** Maintain interactive query performance
- **Availability:** Avoid unnecessary restrictions
- **Practicality:** Minimal changes to existing systems

Core challenge: Trade-off between provable security and system efficiency

### 4.4 A Three-Tier Security Architecture

#### Motivation

- Two-tier (data + queries) inference control:
  - High runtime cost
  - Ignores OLAP characteristics

#### Explanation of Figure 2: Three-Tier Inference Control Architecture

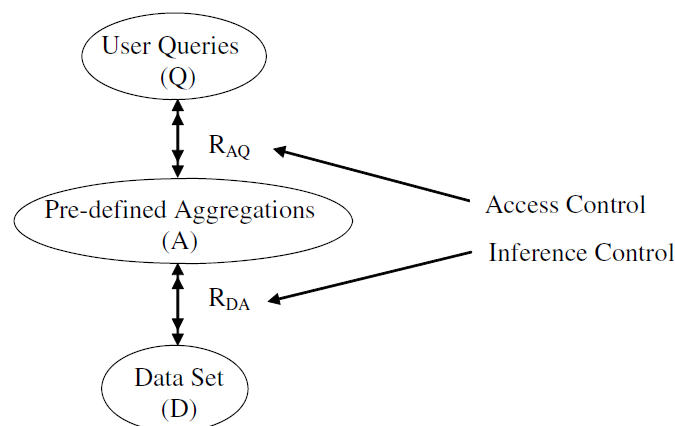


Fig. 2. A Three-Tier Inference Control Architecture

- Introduces **aggregation tier** between data and queries
- Three tiers:
  1. Data tier
  2. Aggregation tier
  3. Query tier

#### Properties of Aggregation Tier

1. Secure w.r.t. data tier via inference control
2. Comparable in size to data tier
3. Partitioned into blocks for localized inference control

#### Benefits

- Heavy inference checking done **offline**
- Online phase reduced to **access control**
- Exploits **materialized views (data cubes)**

### 4.5 Securing OLAP Data Cubes

#### 4.5.1 SUM-only Data Cubes

##### Cardinality-Based Method

- Inference depends on:
  - Number of empty cells
- Uses **linear equations** and **RREF**
- **Figure references:**
  - Table 1: Core cuboid modeling
  - Table 2: Aggregation equations
  - Table 3: RREF showing inferable variable

Table 2. Modeling the Aggregation Cuboids

Table 1. Modeling A Core Cuboid

	$Q_1$	$Q_2$	$Q_3$	$Q_4$	$ALL$
Bob	$x_1$	$x_2$	$x_3$		8500
Alice		$x_4$	$x_5$		10000
Jim	$x_6$			$x_7$	6100
Mallory	$x_8$			$x_9$	12400
ALL	10000	6000	11000	9000	36000

$$\begin{pmatrix} 1 & 1 & 1 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 1 & 1 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 1 & 1 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 1 & 1 \\ 1 & 0 & 0 & 0 & 0 & 1 & 0 & 1 & 0 \\ 0 & 1 & 0 & 1 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 1 & 0 & 1 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 1 & 0 & 1 \\ 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 \end{pmatrix} \times \begin{pmatrix} x_1 \\ x_2 \\ x_3 \\ x_4 \\ x_5 \\ x_6 \\ x_7 \\ x_8 \\ x_9 \end{pmatrix} = \begin{pmatrix} 8500 \\ 10000 \\ 6100 \\ 12400 \\ 10000 \\ 6000 \\ 11000 \\ 9000 \\ 36000 \end{pmatrix}$$

Table 3. The Reduced Row Echelon Form  $M_{rref}$

$$\begin{pmatrix} 1 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 & -1 & 0 & 0 & 0 & 0 \\ 0 & 0 & 1 & 0 & 1 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 1 & 1 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 1 & 0 & 0 & -1 \\ 0 & 0 & 0 & 0 & 0 & 0 & 1 & 0 & 1 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 1 & 1 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \end{pmatrix}$$

#### Key results:

- No empty cells  $\rightarrow$  inference-free
- Too many empty cells  $\rightarrow$  inference unavoidable
- Middle range  $\rightarrow$  requires checking

### Parity-Based Method

- Uses **even-numbered MDR queries**
- Converts inference problem to **graph bipartiteness**
- **Odd cycle  $\Rightarrow$  inference**
- Efficient detection via BFS

### 4.5.2 Generic Data Cubes

- Overcomes SUM-only limitation
- Uses **preventing-then-removing** strategy

### Access Control

- Sensitive data may exist in aggregation cuboids
- Introduces:
  - Below() for lattice-based partitioning
  - Slice() for dimensional partitioning
- Authorization objects include ancestors

### Lattice-Based Inference Control

#### Explanation of Figure 3: Preventing m-d Inferences

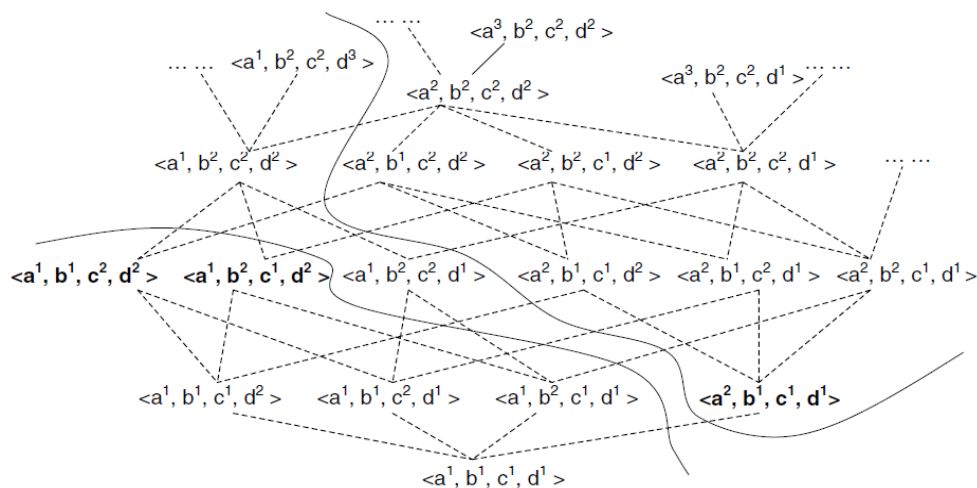


Fig. 3. An Example of Preventing m-d Inferences

- Uses **descendant closure**
- Only one minimal descendant allowed
- Prevents m-d inferences without detection
- Iterative removal of 1-d inferences

### Theorem 3

- Descendant closure is:
  - Necessary
  - Sufficient
  - Maximal for preventing m-d inferences

### 4.6 Conclusion

- OLAP systems face serious **inference-based security threats**
- Traditional inference control is insufficient
- Three methods reviewed:

1. Cardinality-based
  2. Parity-based
  3. Lattice-based (most general)
- **Three-tier architecture** is key for efficiency
  - Preventing-then-removing approach avoids infeasible inference detection
  - Provides a promising direction for **secure OLAP systems and data warehouses**