## Trust establishment in sensor networks: behaviour-based, certificate-based and a combinational approach

# Efthimia Aivaloglou,\* Stefanos Gritzalis and Charalabos Skianis

Information and Communication Systems Security Laboratory, Department of Information and Communication Systems Engineering, University of the Aegean, Samos, Greece E-mail: eaiv@aegean.gr E-mail: sgritz@aegean.gr E-mail: cskianis@aegean.gr \*Corresponding author

Abstract: Sensor networks highly depend on the distributed cooperation among network nodes. Trust establishment frameworks provide the means for representing, evaluating, maintaining and distributing trust within the network, and serve as the basis for higher level security services. This paper provides a state-of-the-art review of trust establishment frameworks for ad hoc and sensor networks. Certain types of frameworks are identified, such as behaviour-based and certificate-based, according to their scope, purpose and admissible types of evidence. The review is complemented by a comparative study built both on criteria specific to each category and on common criteria, grouped into three distinct classes: supported trust characteristics, complexity and requirements and deployment complexity and flexibility. We then present a trust establishment framework targeted for sensor networks that combines aspects from the two alternative approaches on trust establishment on common evaluation metrics, so that it can uniformly support the needs of nodes with highly diverse network roles and capabilities.

Keywords: trust establishment; trust evaluation; ad hoc networks; sensor networks.

**Reference** to this paper should be made as follows: Aivaloglou, E., Gritzalis, S. and Skianis, C. (2008) 'Trust establishment in sensor networks: behaviour-based, certificate-based and a combinational approach', *Int. J. System of Systems Engineering*, Vol. 1, Nos. 1/2, pp.128–148.

**Biographical notes:** Efthimia Aivaloglou received a Diploma in Information and Communication Systems Engineering from the University of the Aegean, Greece and an MSc in Advanced Computer Science from the Department of Computer Science, University of Manchester, UK. She is currently a PhD candidate in the Department of Information and Communication Systems Engineering at the University of the Aegean. She is working on the field of information and communication systems security, and her research focuses on security, trust and privacy in wireless ad hoc and sensor networks. Stefanos Gritzalis received a BSc in Physics, an MSc in Electronic Automation and a PhD in Informatics all from the University of Athens, Greece. Currently, he is an Associate Professor and the Head of the Department of Information and Communication Systems Engineering, University of the Aegean, Greece as well as the Director of the Info-Sec-Lab Laboratory. He has been involved in several national and EU funded R&D projects in the areas of information and communication systems security. His published scientific work includes several books on information and communication systems security topics, and more than 150 journal and national and international conference papers.

Charalabos Skianis is a PhD, SMIEEE and is an Assistant Professor at the University of the Aegean, Samos, Greece. He works on mobile and wireless networking; ubiquitous and pervasive computing; E2E QoS over heterogeneous networks; convergence and interworking aspects of wireless, mobile and broadcast networks. His work is published in journals, conference proceedings and as book chapters. He acts within Technical Program and Organising Committees for numerous conferences and workshops and as a Guest Editor for scientific journals. He is on the Editorial Board of journals, a Member of professional societies and a Reviewer for scientific journals. He is the Secretary of the IEEE ComSoc CSIM TC and Editor-in-Chief for the book series *Emerging Communication and Service Technologies* with Troubador Publishing Ltd.

#### 1 Introduction

Mobile ad hoc networks are temporary wireless networks, formed dynamically by a set of mobile nodes without relying on any central infrastructure. Ad hoc networks are characterised by randomly changing topologies, distributed control and cooperative behaviour. Sensor networks, as a special case of ad hoc networks, are composed of inexpensive, small and resource constrained sensor nodes, densely spread over sensing fields. The distributed and dynamic nature of these types of networks are highly desirable properties when considering the design of security solutions for Critical Information Infrastructures (CIIs). CIIs, offering information and communication services which are significantly affecting quality of life, safety and economic activities, may thus include ad hoc and sensor network technologies not only for the provision of context-rich services, but also for their protection in crisis situations.

The design of secure ad hoc and sensor networks is an active research area. Securing ad hoc and sensor networks generally entails ensuring the confidentiality and integrity of the data communicated, providing the means for node authentication and access control, along with lower level security issues like secure routing and node grouping. However, several works (e.g. Ganeriwal and Srivastava, 2004; Pirzada and McDonald, 2004; Virendra et al., 2005; Yan et al., 2003) argue that the conventional view of security does not suffice provided the unique characteristics of ad hoc networks, that are susceptible to a variety of node misbehaviours. From compromised nodes acting as internal attackers to legitimate nodes that act selfishly or maliciously, internal misbehaving nodes are a vulnerability that cannot be tackled using authentication and cryptography alone. This vulnerability, along with the cooperative nature of ad hoc and sensor networks, rise the necessity for assessing the trust relationships among the network nodes. The trust relationships established between

network nodes could be used for the provision of higher level security solutions, such as trusted key exchange or secure routing.

The trust evaluation requirements and challenges posed by ad hoc networks are substantially different from the case of traditional wired networks. The existence of trusted third parties used as intermediaries for establishing trust relationships cannot be taken for granted, trust relationships change frequently due to the dynamic topology, while trust evaluation may be based on uncertain and incomplete evidence due to connectivity problems. To tackle the aforementioned new challenges, trust establishment frameworks have been proposed for representing, evaluating, maintaining and distributing trust among ad hoc network nodes.

However, considering the application of those frameworks in the case of sensor networks, they are either found too computationally complex, or they do not exploit the predeployment knowledge that will usually exist in sensor network deployments. The trust establishment framework that is presented after the comparative evaluation is targeted specifically for sensor networks. Its main objective is that it should uniformly support the needs of nodes with highly diverse network roles and capabilities, by exploiting the predeployment knowledge on the network topology and the information flows. Its novel characteristics include combining aspects from certificate-based and behaviour-based trust establishment in a unified framework, enabling the exploitation of predeployment knowledge in order to adjust the supported trust characteristics for each node, and allowing for the adjustment of trust degradation according to the distance from preestablished trust relationships.

The rest of this paper is organised as follows: Section 2 discusses the notion of trust in sensor networks and the challenges and requirements related to trust establishment. Section 3 presents a selection of the trust establishment frameworks, separated into two categories according to their scope and purpose, and compared according to criteria specific to each category. Section 4 contains the comparative evaluation on issues that are common for all frameworks presented, and discusses issues related to the applicability on sensor networks. The proposed framework, the metrics that it uses and the preconfiguration it requires are described and analysed in Section 5. Finally, Section 6 concludes this paper and suggests future directions.

#### 2 The notion of trust in sensor networks

The notion of trust, as used in different research areas like trusted computing, trusted platforms, trusted code and trust management, has received various interpretations (Gollmann, 2006). Throughout this work, we study the in-network trust relationships that can exist between network entities. We use the notion of trust as 'The quantified belief by a trustor with respect to the competence, honesty, security and dependability of a trustee within a specified context' (Grandison, 2003). A trust relationship is established by two parties, the trustor and the trustee, also referred to in this work as the trust issuer and the target. The *trust establishment* process includes the specification of valid types of evidence, and its generation, distribution, collection and evaluation (Theodorakopoulos and Baras, 2004).

*Trust evidence*, which forms the basis for establishing trust relations, may be uncertain, incomplete, stable and long term (Eschenauer et al., 2002). *Trust evaluation* is performed by applying context-specific rules, metrics and policies on the trust evidence. The result of the process is the *trust relation* between the trustor and the trustee, usually represented as a certificate or as a numeric value, either discrete or in a

#### Trust establishment in sensor networks

continuous range. Trust relations can be *revoked* on the basis of newly obtained evidence. Trust is *transitive* if it can be extended beyond the two parties between whom it was established, allowing for the building-up of trust paths between entities that have not directly participated in a process of trust evaluation. In general, the problem of formulating evaluation rules and policies, representing trust evidence and evaluating and managing trust relationships is referred to as the *trust management* problem (Blaze, 1996).

Provided that sensor networks highly depend on the distributed cooperation among network nodes, while being susceptible at the same time to node misbehaviour, the formation of trust relationships within the network could serve as the basis for higher level security solutions. However, the inherent properties of sensor networks both at node and network level pose challenges unique for the trust management area. Sensor nodes have constrained energy, memory, computation and communication capabilities. The wireless nature of communications, the dynamically changing topology and membership and the lack of fixed infrastructure are also parameters that affect the design of trust evaluation frameworks for sensor networks. The lack of centralised monitoring and management points preclude the use of trusted intermediaries, such as trusted third parties or Certification Authorities (CAs) for trust establishment. Each node needs to manage trust relationships with other nodes individually. Due to the vulnerability of wireless links and the frequent topology changes, connectivity cannot be assured, and thus stable hierarchies of trust relations cannot be supported. Moreover, because of the varying connectivity and the dynamic topology, trust establishment needs to support evidence that may be uncertain and incomplete, since it can only be sporadically collected and exchanged for each node under evaluation (Eschenauer et al., 2002; Theodorakopoulos and Baras, 2004).

The susceptibility to node misbehaviour can affect not only network operations, but also the trust evaluation framework itself. Especially for frameworks that require cooperative trust evaluation, it is crucial that the nodes are willing to cooperate by making recommendations or evidence that they may hold for the target node available. However, this is not the case in sensor networks, since nodes may behave selfishly to preserve resources. Malicious nodes may also perform bad mouthing attacks against legitimate nodes to spread bad reputation, either by directly spreading false evidence or by pretending to be victims of bad mouthing themselves to make a legitimate node look malicious (Shi and Perrig, 2004).

An additional requirement that mainly applies to sensor networks, is that preestablished and stable trust relationships should be supported. Unlike the general case of ad hoc networks, in the case of sensor networks predeployment knowledge on the roles of the network nodes and their trust associations will usually be available. Some sensor nodes may be clustered by deployment so that the trust relationships within the cluster may be assumed long term and stable. Within predefined clusters like body sensor networks, for example, trust relationships between the nodes do not need to be continuously evaluated. Trust establishment frameworks for sensor networks can exploit the predeployment knowledge that will usually be available in the deployments, by allowing for the preconfiguration of stable trust relationships. Moreover, depending on the application space and the role of each node in the network, both its capabilities and its trust evaluation requirements can be highly diverse. Diversity can be identified in the roles of the nodes, which can be from simple sensor nodes to cluster heads and gateways to other networks, in their computational capabilities, in the type of information that they collect, in their mobility and the possibility of their regular maintenance. More importantly, depending on the application domain of the deployments, diversity exists in the level of distrust that the nodes should exhibit during the network lifecycle towards unknown parties.

As a result, trust establishment protocols for sensor networks should:

- Be decentralised, not based on online trusted parties. Instead, they should support distributed, cooperative evaluation, based on uncertain evidence.
- Support and exploit the diversity in the roles and the capabilities of the nodes in the deployments by allowing for flexibility in the trust establishment process.
- Support trust revocation in a controlled manner.
- Scale to large deployments, be flexible to membership changes and entail acceptable resource consumption.

#### **3** Trust establishment frameworks for ad hoc and sensor networks

The trust establishment frameworks proposed for ad hoc and sensor networks can be classified into two categories according to their scope, purpose and type of evidence that trust evaluation is based on (Aivaloglou et al., 2006).

Certificate-based frameworks aim to define mechanisms for predeployment knowledge on the trust relationships within the network, usually represented by certificates, to be spread, maintained and managed either independently or cooperatively by the nodes. Trust decisions are mainly based on the provision of a valid certificate, which proves that the target node is considered trusted either by a CA or by other nodes that the issuer trusts. It is generally outside the scope of certificate-based frameworks to evaluate the behaviour of nodes and base trust decisions on that evaluation.

In behaviour-based frameworks, each node performs trust evaluation based on continuous monitoring of the behaviour of its neighbours, in order to evaluate how cooperative they are. Although a mechanism that determines the identities of the nodes is usually assumed to exist, it is generally outside the scope of behaviour-based trust establishment models to securely authenticate other nodes and to determine whether they are legitimate members of the network. In that sense, behaviour-based models are more reactive than certificate-based models. As an example, if a node makes unauthorised use of the network and behaves selfishly or maliciously, it will not manage to gain or retain a trust level that will allow it to cooperate with other nodes, and it will be thus isolated.

Alternatively, the frameworks are characterised as hierarchical or distributed, according to the type of ad hoc or sensor networks they were designed for. Hierarchical frameworks assume the existence of a hierarchy among the nodes, based on their capabilities or level of trust. These frameworks may specify, for example, that CAs or trusted third parties provide online or offline evidence. Distributed frameworks assume that there is no fixed infrastructure, and the responsibility of acquiring, maintaining and spreading trust evidence is equally spread among the network nodes. This distinction mainly applies for certificate-based frameworks, since the behaviour-based are all designed for distributed networks.

#### 3.1 Certificate-based trust establishment

The most widely used approach for certificate-based trust establishment is the traditional, hierarchical, public key infrastructure model formed as an organisation of CAs. The use of online CAs for ad hoc networks, however, is problematic for connectivity and service

availability reasons. Three generic approaches for certificate-based trust establishment have been proposed, two of which are hierarchical and one is distributed. In the first hierarchical approach, trust is represented by certificates signed by offline trusted third parties, whose public keys the trustors need to possess to verify the signatures. The second is a fully distributed self-organised public key management scheme, where trust is evaluated using certificate chains. The third one utilises secret sharing mechanisms to distribute trust to an aggregation of nodes that can collaboratively provide CA services. This is considered to be a hierarchical approach, since trust is distributed among a subset of network nodes, that are designated to represent a CA.

#### 3.1.1 Hierarchical trust frameworks

A hierarchical progressive trust negotiation scheme for ad hoc networks is introduced by Verma et al. (2001). Offline trusted third parties are set responsible both for issuing the certificates required for each node, including a network address certificate and at least one identity certificate, and for issuing certificate revocation lists. The model includes the notion of certificate release policies that are used to enforce a negotiating strategy for each node, in order for the disclosure of information to be controlled during trust negotiation. Each node in the network stores the certificates of the third parties and the certificate revocation lists they have issued, along with the local certificates to be used in trust negotiation. Trust negotiation is carried out by incrementally exchanging certificates.

Davis (2004) proposes a scheme that similarly uses certificates based on a hierarchical trust model to manage trust, and also enables explicit revocation of certificates without input from trusted third parties. Any node j is considered trusted by any node i once it presents a certificate that has not expired, has not been revoked, and i can verify using the public key of a third party. Nodes have to maintain locally their private keys and the public keys of the third parties.

To handle certificate revocation without input from third parties, nodes maintain certificate status tables and profile tables which are used to determine whether or not a given certificate should be revoked. The profile tables kept by all nodes in the network should be consistent. In case, inconsistencies are found by any node, accusations are broadcasted for the nodes that sent the inconsistent data. The two tables of all nodes are updated when an accusation is broadcasted, thus the accused node's certificate is revoked and network access is denied. In order to defend against bad mouthing attacks, the authors propose the final decision on certificate revocation to be based on a sum of weighted accusations from independent nodes.

#### 3.1.2 Distributed trust frameworks

In contrast to the hierarchical frameworks, where certificates are issued by trusted third parties, distributed frameworks provide mechanisms for trust evaluation between network nodes in a cooperative, self-organised manner. The Pretty Good Privacy model (PGP) (Garfinkel, 1995) was the first to enable users to act as independent CAs, expressing their trust on other users (the confidence on their identity) by validating their public keys. The public key certificates of this so-called 'web of trust' approach are assigned with trust levels and confidence levels. However, although certificates are issued by the users, publicly accessible certificate directories are required for their distribution, which makes the model inapplicable for ad hoc networks.

A framework that uses the 'web of trust' approach of the PGP model, without requiring certificate directories for the distribution of certificates, is proposed by Hubaux et al. (2001). The relationships between users are modelled as a directed graph, called trust graph, whose edges represent public key certificates. Each user maintains a subset of the trust graph as a local repository of certificates issued by himself or other users in the system. A subgraph selection algorithm is proposed, which is called Shortcut Hunter Algorithm. When a user i wants to obtain the public key of user j, they merge their subsets of trust graph stored in their repositories and i tries to find a trust route in the form of a certificate chain from i to j in the merged repository.

To deal with dishonest users issuing false certificates, an authentication metric is introduced as a function that takes two users i and j and a trust graph as inputs and returns a value that represents the assurance with which i can obtain the authentic public key of j using the trust graph. This framework is considered practically inapplicable for ad hoc networks because it requires extensive public-key operations for constructing certificate chains (Pirzada and McDonald, 2004; Weimerskirch and Thonet, 2002).

The distributed trust establishment framework proposed by Eschenauer et al. (2002) takes a broader view on the inputs required for node trust decisions by accepting as trust evidence not only certificates and public keys, but also information like identities, locations or independent security assessments. The type of information required depends on the policy and the evaluation metric each node uses to establish trust. Trust metrics are used to assign confidence values to available pieces of evidence that may be uncertain or incomplete, while policy decisions are defined as local procedures that, based on the evidence and the confidence assigned to it, output a trust decision.

The framework is fully distributed. Any node can generate trust evidence about any other node and make it available to others through the network, as long as it signs it with its private key and specifies its lifetime. Evidence revocation is supported through revocation certificates and by the generation and distribution of contradictory evidence. To protect against bad mouthing attacks, when evidence revocation occurs, it is proposed that the policy decisions require redundant pieces of evidence from independent sources to proceed to the evaluation.

#### 3.1.3 Distributed CA frameworks

The use of secret sharing to distribute the CA functionality among a set of nodes in ad hoc networks was first proposed by Zhou and Haas (1999). Their Distributed Public Key Model takes advantage of redundancies in the network topology to achieve availability of the CA service, that is provided by an aggregation of nodes that trust is distributed to. The model uses threshold cryptography to distribute the private key of the CA over a number of network nodes n, that share the ability to perform cryptographic operations. The scheme allows for any t + 1 out of n nodes to combine their partial keys to collaboratively generate the secret key of the service and sign certificates, whereas this would be unfeasible for any t nodes (Table 1).

For an adversary to acquire the secret key, at least t + 1 of the designated nodes must be compromised. In order to tolerate mobile adversaries, the authors make their threshold cryptography scheme proactive by using share refreshing. This enables the designated nodes to derive new partial keys from the old ones in collaboration, without having service secret key disclosed to any of them.

framework C/PK RI Hierarchical trust frameworks Verma et al. (2001) + + +	CD	CF	TD			
Hierarchical trust frameworks Verma et al. (2001) + + +			1			
Verma et al. (2001) + + +						
				i,j,n CAs	$i:C_A^A$ and n CRLs, $j:C_j^A$	$C_x^A, K_x, n C_A^A s$
Davis (2004) + + +				i, j, n offline CAs	$i:C_A^A$ and RI, $j:C_j^A$	$C_x^A, K_x, n C_A^A s$
Distributed trust frameworks Hubaux et al. (2001) +				<i>i.i</i>	i:REP. i:REP.	$K_{\cdot}$ . REP.: $nC^{z\in N}$ s
Eschenauer et al. (2002) + +	+	+	+	<i>i</i> , <i>j</i> , any other	j, any other	Keys, Policy, Metrics
Distributed certification authority frameworks						
Zhou and Haas (1999) +				<i>i</i> , <i>j</i> , <i>t</i> +1 partial CAs	$i:C_A^A, CAs:C_j^A$	$x: K_x, CAs: K_{t \in CAs}^{partial}$
				i, j,t+1 partial CAs	$i:C_A^A$ and RI, CAs: $C_A^A$	$x: K_x, CAs: K_{reCAs}^{partial}$

 Table 1
 Characteristics of certificate-based trust frameworks

Trust establishment in sensor networks

The Mobile CA framework, presented by Yi and Kravets (2003), similarly uses threshold cryptography to distribute trust. Provided that heterogeneity is expected to exist among ad hoc network nodes, the nodes that are assigned with CA functionality, called MOCAs, are selected according to criteria like computational power, physical security or risk of compromise. The framework includes a communication protocol that client nodes are equipped with in order to correspond with MOCAs for certification services, by contacting at least t + 1 MOCAs and receiving at least t + 1 replies.

The framework deals with trust revocation through certificate revocation lists, stored at each node, at the MOCAs, or at a set of specially designated nodes. For a certificate to be revoked, each MOCA signs a revocation certificate with its partial key and broadcasts it. When revocation certificates are gathered from at least t + 1 MOCAs, the certificate revocation list is updated. Bad mouthing attacks could thus only be successful if t + 1 MOCAs are compromised.

#### 3.1.4 Summary and remarks

The PGP-like distributed trust frameworks are considered to offer more flexibility than the hierarchical frameworks, but may not be suitable for applications where high degrees of accountability and security are required (Davis, 2004). The main reasons are that they are less structured and more prone to attacks by malicious agents, since it does not have any central management point like a CA, enforcing strict policies on trust assessment.

The Distributed CA Frameworks considered are quite robust, but are the ones that impose the greater deployment complexity and have the higher communication requirements per evaluation request. Moreover, it is considered that threshold cryptography is too computationally expensive to be used in ad hoc networks. Finally, these frameworks require cooperation of ad hoc network nodes that may behave selfishly to preserve resources (Davis,2004; Hubaux et al., 2001). For these reasons, the applicability of secret sharing schemes in ad hoc networks is considered limited.

#### 3.2 Behaviour-based trust establishment

The behaviour-based trust models view trust as the level of positive cooperation between neighbouring nodes in a network. Trust is evaluated both independently by each node based on observations and statistical data that is being continuously accumulated by monitoring the network traffic, and cooperatively through sharing recommendations and spreading reputation. The basic aim of these behaviour-based models is to isolate the nodes that either act maliciously because they have been compromised, or selfishly in order for example to preserve resources, by assigning and recommending low levels of trust.

The result of the independent evaluation is called *direct trust*, since it is based on the direct experience the trustor node may have on the trustee node. The evidence collection mechanisms are usually placed below the application layer, in order to evaluate routing behaviours and information integrity. In the context of sensor networks, even the raw data communicated could be evaluated for consistency among neighbouring nodes (Ganeriwal and Srivastava, 2004). What should be noted however is that monitoring the network traffic is very resource consuming, in terms of computation, memory and energy. For example, the radio on each node needs to be continuously enabled, while the trust values of all neighbouring nodes need to be stored and continuously updated as interactions occur.

*Indirect trust* is derived using recommendations from other nodes, which usually are their trust values for the target node. Selection criteria may be applied for the neighbouring nodes that will provide the recommendations (Virendra et al., 2005). The indirect trust derivation process may include weighting the recommendations of other nodes based on how trusted they are (Ganeriwal and Srivastava 2004; Theodorakopoulos and Baras, 2004; Virendra et al., 2005), or providing confidence values along with the recommendations (Theodorakopoulos and Baras, 2004). The result of the recommendations exchange for computing indirect trust is that node reputation is spread through the network, enabling the formation of a connected trust graph. The most important factor that could hinder this process is node selfishness and unwillingness to spread reputation information. Including node cooperation on reputation spreading for the calculation of direct trust is one of the countermeasures.

The functions that are specified in most behaviour-based trust frameworks in order to evaluate the trust value of the trustor network node i to the trustee network node j are:

- A function DT(*i*, *j*) for calculating the direct trust value, based on previous interactions and network traffic monitoring metrics. This function is considered implementation dependent and, as such, it is not explicitly defined in the trust evaluation frameworks that are studied.
- A function IDT(*i*, *j*) for calculating the indirect trust value based on recommendations from neighboring nodes.
- A function *T*(*i*, *j*) for calculating the final trust decision through balancing the relationship between direct and indirect trust. The result of this calculation is compared against a trust threshold to reach the final decision on node cooperation. Frameworks like (Yan et al., 2003) also include context and action specific metrics for computing *T*.

The factors being used by the trust frameworks in this section regarding the computation of the direct and indirect trust and the final decision are enlisted in Table 2. The symbols representing the factors in the table are also being used for the representation of the trust evaluation functions. For uniformity reasons, the functions presented in the following paragraphs use a set of symbols that are different from those used on the original forms.

#### 3.2.1 Behaviour-based frameworks

Yan et al. (2003) proposed one of the first behaviour-based trust evaluation frameworks for ad hoc networks. It defines a trust evaluation matrix for each network node to store the knowledge derived through both network traffic monitoring and recommendations. While the framework does not include functions for direct trust computation or indirect trust combination, it proposes a linear function that computes the trust value for an action *a* based on the evaluation parameters in the trust matrix and the preferences of the trustor node. The preferences are expressed as factor rates, each used for weighting a factor as expressed in Table 2. Additional factors include the importance of the communication data, the presence in black lists and other parameters like energy left, frequency of routing request, etc.

A trust model for finding trustworthy routes in ad hoc networks that is entirely based on direct trust evaluation is proposed by Pirzada and McDonald (2004). In their model, they make use of independent trust agents that reside on network nodes, each one gathering

Trust	Dùr	Direct trust evaluation	aluation		Indirec	t trust evalu	uation	Indirect trust evaluation Combination and final decision	nal decision
framework	MTM	WCE	WFE	BL	R	RCF	WCR	WCDI	CA
Yan et al. (2003)	+			+	+			+	+
Pirzada and McDonald (2004)	+	+							
Theodorakopoulos and Baras (2004)	+				+	+	+		
(Ganeriwal and Srivastava, 2004)	+		+		+		+		
Virendra et al. (2005)	+				+		+	+	

for the Events(WFE), Black Lists (BL), (R)-Recommendations From Neighbouring Nodes, Confidence (WCE), Freshness as Weight Factor Weighted Combination of Recommendations (WCR), Weighted Combination of DT - IDT (WCDI) and Context and Action (CA) specific metrics like value of data, energy left, QoS, etc.

 Table 2
 Evaluation parameters of behaviour-based trust frameworks

network traffic information in passive mode by applying appropriate taps at different protocol layers. The information gathered from these events is classified into trust categories, so that the *situational trust* TS(i, j, x) for node j can be computed using the information of trust category x. Moreover, weights  $W_i(x)$  are assigned according to the utility and importance of each trust category to i. The general trust is thus computed as the trust that the trustor node i assigns to the trustee node j based upon all previous transactions in all situations, according to their significance:

$$T(i, j) = \text{DT}(i, j) = \sum_{x=1}^{n} [W_i(x)\text{TS}(i, j, x)]$$
(1)

A different view on trust evaluation is proposed by Theodorakopoulos and Baras (2004), who mainly focus on the evaluation of indirect trust as the combination of opinions from neighbouring nodes, assuming that some mechanism exists for these nodes to assign their opinions based on local observations. The process of indirect trust evaluation is formulated as a shortest path problem on a weighted directed graph, where graph nodes represent network nodes and edges represent trust relations. The edges are weighted with the trust value the issuer node has on the target node and the confidence value it assigns on its opinion, depending on the number of the previous interactions and positive direct evaluations. The trust inference problem: finding the trust-confidence value that node i should assign to node j, based on the trust-confidence values of the intermediate nodes, and finding a sequence of nodes that has the highest aggregate trust value among all trust paths from i to j.

Ganeriwal and Srivastava (2004) propose a different framework for the evaluation of indirect trust, that is designed for wireless sensor networks. The Reputation-based Framework for Sensor Networks (RFSN) includes a watchdog mechanism for monitoring the behaviour of neighbouring nodes in terms of data forwarding and raw sensing data consistency. Each sensor node maintains reputation for other nodes in the form of a probabilistic distribution, and trust is obtained by taking its statistical expectation. Reputation  $R_{i,j}$  is built based on the results of the watchdog mechanism (direct reputation) in combination with second-hand information for deriving the indirect reputation IDR<sub>*i*,*j*</sub>. The following equation is defined for computing the indirect reputation by weighting the second-hand information from the neighbouring nodes of *i*, denoted as  $N_i$ :

$$IDR_{i,j} = IDR_{i,j} + \{g(R_{i,k})R_{k,j}\} \forall k \in N_i$$

$$\tag{2}$$

Within the framework of RFSN, the authors propose an example system based on a Bayesian formulation for representing reputation and trust evolution. What is of special interest is the incorporation of exponential averaging when combining reputation information in order to place more weight on recently obtained information. Moreover, they propose propagation of good reputation information only to protect against bad mouthing attacks.

Huang et al. (2006) developed a similar trust evaluation model, one extension of which is the requirement for an authentication mechanism to ensure that all identities are trustworthy. Except from the Bayesian formulation, the authors also propose the Dempster-Shafer Theory of Evidence for combining evaluations. In order to improve the resilience of trust evaluation against bad mouthing attacks, Zouridaki et al. (2006) extrended the collection of direct trust evidence among neighbouring nodes to non-neighbouring nodes through an acknowledgement protocol, and included recommender trustworthiness metrics in indirect trust evaluation.

A Trust-domain based security architecture for mobile ad hoc networks is proposed by Virendra et al. (2005). It includes a behaviour-based trust evaluation framework that is used both as the basis for key establishment decisions and for secure node grouping that can enable distributed control in the network. Trust evaluation is based both on direct and indirect knowledge. For computing direct trust, network monitoring parameters related to traffic volumes and information integrity are listed and a traffic statistics function is presented but not precisely defined. Four schemes are proposed for combining indirect trust information, the most sophisticated of which is the double weighted approach:

$$IDT(i, j) = \frac{\sum_{k \in O} T(k, j) / \sum_{m \in O} T(m, j) T(i, k)}{\sum_{k \in O} T(i, k)}$$
(3)

The set *O* appearing in the equation is the set of nodes in the range of both *i* and *j*, that *i* trusts above a certain threshold. Function T(i, j) for calculating the final trust decision balances the relationship between direct and indirect trust through utilising weighting factors.

#### 3.2.2 Summary and Remarks

It can be observed from the frameworks presented above that, several formalisations of different complexity have been proposed, from weighted average to the use of probabilistic distributions and semirings, for the most interesting function in trust evaluation, the one for calculating the indirect trust value based on recommendations. The exchange of recommendations enables the view of the network as a connected trust graph, where trust is gradually built for each node through good reputation, but also gradually revoked as a result of malicious behaviour. In the presence of intrusion detection mechanisms issuing black lists, only the framework proposed by Yan et al. (2003) enables immediate trust revocation. It is also noted that none of the frameworks supports preestablished and stable trust relationships, since they do not include any bias with respect to the identity of the node under evaluation.

#### 4 Comparative evaluation

The comparison of the trust establishment frameworks that were presented in the previous sections is based on the following three criteria: The characteristics of trust that each framework supports, the complexity and resource requirements it would impose and its deployment complexity and flexibility. The applicability of each framework in sensor networks is separately discussed. Emphasis here is given on common issues for behaviour-based and certificate-based frameworks, since those that are specific for each category are already discussed at the corresponding sections. Table 3 presents the evaluation of each framework for the following categories of criteria:

Supported trust characteristics Include support for uncertain evidence, transitivity of trust and trust revocation. The use of uncertain evidence is characterised as controlled for frameworks that support assignment of confidence values to evidence supplied for trust evaluation, including recommendations from other nodes. Transitivity of trust, if supported, is considered controlled if trust values from third parties are weighted according to the trust relationship the requester has with the third party, before being used for trust evaluation. For frameworks that support trust revocation, it is considered controlled if either trust is revoked only by trusted third parties or some mechanism exists to protect from bad mouthing attacks. Moreover, trust revocation is characterised gradual if trust is not revoked explicitly, but as the result of bad reputation spread gradually due to node misbehaviour.

*Complexity and requirements* In memory, computational power and communications. Due to the lack of homogeneity among the frameworks in the data structures used as evidence, the algorithms and functions used as primitives for trust evaluation and the communication patterns during the trust establishment process, the evaluation on these criteria is somewhat subjective. It is considered that a model has high memory requirements if each node needs to store information about every other node in the network, or maintain detailed information about previous interactions and events. High computational power would be required to perform frequent public-key operations, or for continuously monitoring surrounding nodes and reevaluating trust relationships based on every event monitored. Communication requirements increase the more messages need to be exchanged between the interested nodes or third parties for a trust relationship to be established or revoked, and the more broadcasts that are required, either for trust revocation or for initialisation when a new node enters the network.

*Deployment issues* Include preconfiguration, scalability and extensibility issues. The amount and complexity of the required preconfiguration is characterised as high when detailed trust policies and metrics need to be defined for each node, or when the keying material each node needs to be supplied with requires special selection or generation algorithms. Scalability and extensibility decisions are based on how the model would scale on large deployments, and how easily new nodes could be added. For example, low scalability and extensibility is assigned for models that require each node to maintain information for all other nodes, and update it every time a new node enters and broadcasts its information.

An issue that is not included in Table 3 is the additional *battery power consumption* the application of each model would impose to ad hoc network deployments. The issues included in the complexity and requirements category affect the energy requirements in different degrees. However, although behaviour-based trust evaluation models appear less complex, they would probably be more energy consuming because they require nodes to keep their radio constantly on in order to monitor their neighbours.

Concerning the *representation of trust*, none of the frameworks uses discrete values, since it is considered too restrictive. Behaviour-based evaluation frameworks represent trust in a continuous range and compare its value with a trust threshold to decide on node cooperation. Certificate-based frameworks base the decision on node cooperation on the provision of a trusted certificate, that is, a certificate that either is valid since it is signed by a (distributed or centralised) trusted third party, or a trusted certificate chain that includes it can be formulated.

The issue of tackling *node selfishness*, that is especially important for frameworks that entail node cooperation, either for reputation spreading or for providing CA functionality, is not sufficiently addressed in the frameworks studied. In the model proposed by Weimerskirch and Thonet (2002), incentives and punishment mechanisms are specified for recommending nodes.

Framework	TR RC	MEM	CMP	CMN	PC	SE
Certificate-based trust frameworks						
Verma et al. (2001) U	N C, I	Μ	Μ	Н	Μ	Н
Davis et al. (2004) U	N C,I	Н	Н	Н	Μ	Μ
Hubaux (2001) U	N	M	Н	Μ	M	Μ
Eschenauer et al. (2002) C	C C,I	Μ	Μ	M	Н	Н
Zhou and Haas (1999) U	Z Z	M	Н	Н	Н	Н
Yi and Kravets (2003) U	N C, I	Н	Н	Н	Н	Η
Behaviour-based trust frameworks						
Yan et al. (2003) U	U U, G/I	M	Μ	Μ	Μ	Σ
Pirzada and McDonald (2004) U	N U, G	M	L	Γ	L	Η
Theodorakopoulos and Baras (2004) C	C U,G	L	Μ	Μ	L	Μ
Ganeriwal and Srivastava (2004) U	C C C	L	Μ	M	Г	Μ
Virendra et al. (2005) U	C U, G	Н	Μ	Μ	L	Η

 Table 3
 Comparative analysis of trust establishment frameworks for ad hoc networks

## E. Aivaloglou, S. Gritzalis and C. Skianis

None of the behaviour-based models supports *preestablished and stable trust relationships*. From the certificate-based frameworks, preestablished trust could be supported by Eschenauer et al. (2002) through introducing identity related bias in the trust metrics and policies of the nodes. For the framework introduced by Hubaux et al. (2001), this requirement could be satisfied if the certificate repositories of nodes were configured to include the certificates of trusted nodes that each issuer should maintain direct and stable trust relationships with.

#### 4.1 Applicability on sensor networks

The main issues that need to be taken into account for assessing the applicability of the presented frameworks on sensor networks are related to their complexity and resource requirements. As explained in Section 2, sensor nodes are severely constrained regarding their energy, memory, computation and communication capabilities. Behaviour-based trust evaluation frameworks utilise techniques similar to the ones of intrusion detection schemes, which are considered expensive in terms of memory, energy and communications requirements (Perrig et al., 2004). Both the need for nodes to keep their radio constantly on in order to monitor their neighbours, and the need for continuous evaluation of their trust values, are unrealistic for the constrained sensor nodes. The same constraints in memory and computational capabilities pose concerns on the applicability of the certificate-based trust frameworks, that utilise asymmetric cryptography, which is considered too expensive for sensor nodes (Arazi et al., 2005; Shi and Perrig, 2004).

It is our belief, however, that both the behaviour-based and the certificate-based frameworks that have been proposed are better targeted for ad hoc than for sensor networks. The main reasons are that they do not exploit the predeployment knowledge that will usually be available in sensor network deployments, and they do not allow for preestablished, stable trust relationships. None of the behaviour-based frameworks includes any bias with respect to the identity of the node under evaluation. From the certificate-based frameworks, this requirement could be satisfied by the framework proposed by Eschenauer et al. (2002) through introducing identity related bias in the trust metrics and policies of the nodes, and (Hubaux et al., 2001), through appropriate selection of the locally stored subsets of the trust graph.

## 5 A combinational approach for a trust establishment framework targeted for sensor networks

The main objective of the proposed trust establishment framework (Aivaloglou et al., 2007) is to be able to support sensor network deployments of different purposes and application domains, to be applied uniformly throughout the network, and to support through proper configuration from simple nodes that have very restricted role, computational capabilities and should only trust the nodes they are preconfigured to trust, to highly adaptive nodes and supervision nodes. Based on the observation that the two approaches on trust establishment should not be viewed as alternative approaches, but as supplementary, the framework adopts aspects both from certificate-based and from behavior-based trust relationships as certificates and from the continuous behaviour-based evaluation of trust. The results of behavior-based

evaluation are provided as a network service by a subset of the network nodes, so as not to consume the resources of the entire network.

The trust associations between any trust issuer i and any trust target j that the framework supports can be:

- 1 Established prior to deployment through storing locally at each node information on its trust associations.
- 2 Established as hierarchical trust relationships so that each node j is considered trusted by node i if it holds a valid certificate that i can verify using the stored public key of an offline trust managing authority that it has a trust association with. Trust associations can thus be evaluated between nodes that are associated with common trust managing authorities who issue the certificates for particular deployments.
- 3 Established by a cooperative procedure, where i asks for recommendations for j from nodes that it has a trust association with.
- 4 Evaluated and made available by a subset of the nodes, called supervision nodes, that perform behaviour-based trust evaluation and *i* has a trust association with.

The parties that may be involved in the trust establishment procedure are thus offline trusted third parties whose public key is locally stored for signature verification, other sensor nodes, cluster heads or gateways and supervision nodes that perform behaviour-based trust evaluation. For generality, we take a view of a signed certificate from an offline trusted third party as a recommendation with the highest trust value. Table 4 describes the supported trust evidence for each type of trust evaluation. Once the trust relationship of node i with node j needs to be determined, the options on Table 4 can be used. If a trust relationship is not already established either before deployment or as a result of a previous trust establishment procedure, node i first attempts to establish a hierarchical and then a distributed trust relationship.

Trust relationship between i, j	Evidence	Evaluation
Preestablished	Stored $T_{ij} \leq 1, R_{ij} \leq 1$	Not required
Hierarchical, trust	Stored $T_{ix} \geq T_{\text{threshold}}$ ,	Validation of certificate
Managing authority x	stored $R_{ix} \geq R_{\text{threshold}}$ ,	$\Rightarrow T_{xj} = 1$ used
	stored public key of $x$ ,	as a recommendation
	signed certificate of $j$	
Distributed, Set $N_i$ of	Stored $T_{ix} \geq T_{\text{threshold}}$ ,	Combination of
neighbouring nodes and	stored $R_{ix} \geq R_{\text{threshold}}$ ,	recommendations
supervision nodes	$T_{xj}, \forall x \in N_i$	

 Table 4
 Trust establishment evidence and evaluation

A trust association stored locally at node *i* and referring to node *j* contains two metrics, namely the trust metric  $T_{ij}$  and the transition metric  $R_{ij}$ . Both of those metrics should have values above a certain threshold for *i* to accept recommendations from *j* for other nodes. The first is the trust value  $T_{ij} \in [-1, 1]$  of node *i* for *j*, provided by a function that can uniformly calculate the trust value based on the recommendations from the third parties.

This function is common both for hierarchical and for cooperative trust establishment. Using  $N_i$  as the set of trusted nodes that *i* receives recommendations  $T_{xj}$  for node *j*, for the evaluation of  $T_{ij}$  a function can be formulated as:

$$T_{ij} = t(T_{ix}, R_{ix}, T_{xj}, \forall x \in N_i)$$

$$\tag{4}$$

There exists several choices for the function t(.), that should satisfy the requirement that for nodes  $x \in N_i$  where  $R_{ix} = 0$ ,  $T_{xj}$  will not be used for the evaluation, even if  $R_{\text{threshold}} = 0$ . An example simple rule would be the weighted average of the recommendations.

The transition metric  $R_{ij} \in [-1, 1]$  is the second part of a trust association, used to indicate a weight that node *i* will assign to future recommendations from node *j*. An example of the usability of a separate metric is that, during the initial configuration of a node in a cluster, it can be greater than zero only for the cluster head, so that *i* accepts recommendations only from it and not from the other nodes that it trusts. This metric is also used as the means to control trust evolution and spreading according to the level of distrust that each node should exhibit during its lifetime towards unknown parties. The level of distrust is represented as a degradation parameter  $d_i \in [0, 1]$ , used for the calculation of  $R_{ij}$ . Setting  $d_i = 1$  indicates that trust should not degrade according to the number of steps from a node that *i* is preconfigured to trust. Setting  $d_i = 0$  should make  $R_{ij} = 0, \forall j \in$  $N_i$ , and thus *i* should not calculate recommendations from nodes except the ones it is preconfigured to.

The transition metric  $R_{ij}$  is evaluated by a function accepting as parameters  $d_i$  and the transition values of the nodes in  $N_i$ :

$$R_{ii} = r(R_{ix}, d_i, \forall x \in N_i) \tag{5}$$

The function r(.) should enforce the degradation of the value  $R_{ij}$  in relation to  $R_{ix}$  according to  $d_i$ . A possible r(.) can be formulated as:

$$R_{ij} = \max(R_{ix})d_i, x \in N_i \Rightarrow T_{xj} \ge T_{ij}$$
(6)

This function uses for the computation of  $R_{ij}$  the maximum transition value, from the nodes whose recommendations are greater than or equal to the trust value computed for *j*.

For the trust esablishment framework to be applied, the parameterisation of each node *i* during predeployment, should include:

- Setting the preestablished trust associations through assigning values  $T_{ij}$  and  $R_{ij}$  for the nodes *j* that node *i* should trust and receive recommendations from, based on the predeployment knowledge of the network structure.
- Balancing the parameters  $T_{\text{threshold}}$  of the minimum positive trust value,  $R_{\text{threshold}}$  of the minimum transitivity value and the degradation parameter  $d_i$ . The last two parameters are the the ones that eventually determine the maximum allowed distance from preestablished trust relationships that the node can establish during the network lifetime.
- For nodes that have strictly defined roles in the network or have limited computational capabilities, the set of preestablished relationships that recommendations are accepted from should be restrained through setting  $R_{ij} < R_{\text{threshold}}$ .

#### 5.1 Evaluation against requirements

Evaluated against the supported trust characteristics identified in Section ??, the proposed framework does not include support for uncertain evidence, since it does not support assignment of confidence values to evidence supplied for trust evaluation, including the recommendations. This would be beneficial especially for the recommendations provided by supervision nodes. The framework supports controlled trust transitivity, since the trust values from third parties are weighted according to the trust relationship the requester has with the third party. The framework does not yet provide consideration for trust revocation.

The evaluation of the complexity and computational requirements of the framework highly depends on the type of each node and its preconfiguration. It is considered that high computational power would be required to perform public key operations and certificate validations, or to continuously monitor surrounding nodes and reevaluate trust relationships based on every event monitored. The first would only be required by highly adaptive nodes that are preconfigured to support hierarchical trust establishment, while the latter should only be performed by supervision nodes. In the actual sensor network deployments, however, it is expected that the nodes that would be designated for those roles would usually be computationally more powerful than the sensor nodes.

#### 6 Conclusions

The discussion on the behaviour-based and certificate-based trust establishment frameworks and their comparison both in common and in category-specific criteria has highlighted the different approaches taken in the representation and evaluation of trust, and their pros and cons in terms of complexity, requirements and scalability. The differences in scope and purpose between the two categories of frameworks show that they should not be viewed as alternative approaches, but as supplementary. It would be possible, for deployments that require high levels of accountability and security, to combine a certificate-based with a behaviour-based trust framework to benefit both from the representation of predeployment trust relationships as certificates and from the continuous behaviour-based evaluation of trust.

What the comparison has also shown, however, is that the more sophisticated a trust establishment framework is in terms of supported trust characteristics and resilience to node compromise, the more complex and resource consuming it becomes. The computational complexity of the certificate-based and the energy requirements of the behaviour-based trust evaluation frameworks raise concerns related to their applicability on resource constrained sensor nodes. At the same time, none of the frameworks studied aims to fulfil the special requirements of sensor networks on the representation and evaluation of trust relationships.

An attempt towards this direction is the trust establishment framework for sensor networks that was presented. It fulfils its main objectives, that it should be applied uniformly throughout various sensor network deployments, and that it should support through proper configuration the diverse characteristics and needs of sensor nodes. It allows both for flexibility and for restriction of the supported trust characteristics by allowing for configuration based on predeployment knowledge on the network topology and the information flows.

#### References

- Aivaloglou, E., Gritzalis, S. and Skianis, C. (2006) 'Trust establishment in ad-hoc and sensor networks', Proceedings of CRITIS 06 1st International Workshop on Critical Information Infrastructure Security, LNCS 4347, pp.179–194.
- Aivaloglou, E., Gritzalis, S. and Skianis, C. (2007) 'Towards a flexible trust establishment framework for sensor networks', Special Issue of Telecommunications Systems on Security, Privacy and Trust for Beyond-3G Networks, Vol. 35, Nos. 3–4, pp.207–213.
- Arazi, B., Elhanany, I., Arazi, O. and Qi, H. (2005) 'Revisiting public-key cryptography for wireless sensor networks', *IEEE Computer*, Vol. 38, No. 11, pp.103–105.
- Blaze, M., Feigenbaum, J. and Lacy, J. (1996) 'Decentralized trust management', *IEEE Symposium on Security and Privacy*, IEEE Computer Society, pp.164–173.
- Davis, C.R. (2004) 'A localized trust management scheme for ad hoc networks', 3rd International Conference on Networking (ICN'04), pp.671–675.
- Eschenauer, L., Gligor, V.D. and Baras, J.S. (2002) 'On trust establishment in mobile ad-hoc networks', *Security Protocols Workshop*, pp.47–66.
- Ganeriwal, S. and Srivastava, M.B. (2004) 'Reputation-based framework for high integrity sensor networks', Proceedings of the 2nd ACM Workshop on Security of Ad Hoc and Sensor Networks (SASN'04), ACM Press, pp.66–77.
- Garfinkel, S. (1995) PGP : Pretty Good Privacy, O'Reilly & Associates.
- Gollmann, D. (2006) 'Why trust is bad for security', *Electronic Notes in Theoretical Computer Science*, Vol. 157, Elsevier, pp.3–9.
- Grandison, T. (2003) 'Trust management for internet applications', PhD Thesis, Department of Computing, University of London (2003).
- Huang, L., Li, L. and Tan, Q. (2006) 'Behavior-based trust in wireless sensor network', *APWeb Workshops*, Berlin Springer, pp.214–223.
- Hubaux, J.P., Buttyán, L. and Capkun, S. (2001) 'The quest for security in mobile ad hoc networks', MobiHoc '01: Proceedings of the 2nd ACM International Symposium on Mobile Ad Hoc Etworking and Computing, New York, NY: ACM Press, pp.146–155.
- Pirzada, A.A. and McDonald, C. (2004) 'Establishing trust in pure ad-hoc networks', *Proceedings of the 27th Conference on Australasian Computer Science (CRPIT'04)*, Australian Computer Society, Inc. pp.47–54.
- Perrig, A., Stankovic, J. and Wagner, D. (2004) 'Security in wireless sensor networks', *Communication ACM*, Vol. 47, No. 6, pp.53–57.
- Shi, E. and Perrig, A. (2004) 'Designing secure sensor networks', *Wireless Communication Magazine*, Vol. 11, No. 6, pp.38–43.
- Theodorakopoulos, G. and Baras, J.S. (2004) 'Trust evaluation in ad-hoc networks', *Workshop on Wireless Security*, pp.1–10.
- Verma, R.R.S., O'Mahony, D. and Tewari, H. (2001) 'Ntm progressive trust negotiation in ad hoc networks', *Proceedings of the 1st Joint IEI/IEE Symposium on Telecommunications Systems Research.*
- Virendra, M., Jadliwala, M., Chandrasekaran, M. and Upadhyaya, S. (2005) 'Quantifying trust in mobile ad-hoc networks', *IEEE International Conference on Integration of Knowledge Intensive Multi-Agent Systems (KIMAS'05)*, pp.65–71.
- Weimerskirch, A. and Thonet, G. (2002) 'A distributed light-weight authentication model for ad-hoc networks', *Proceedings of the 4th International Conference Seoul on Information Security and Cryptology (ICISC'01)*, Springer-Verlag, pp.341–354.

- Yan, Z., Zhang, P. and Virtanen, T. (2003) 'Trust evaluation based security solution in ad hoc networks', *Proceedings of the Seventh Nordic Workshop on Secure IT Systems*.
- Yi, S., Kravets, R. (2003) 'Moca: mobile certificate authority for wireless ad hoc networks', *Proceedings of the 2nd Annual PKI Research Workshop*.

Zhou, L. and Haas, Z.J. (1999) 'Securing ad hoc networks', IEEE Network, Vol. 13, No. 6, pp.24-30.

Zouridaki, C., Mark, B.L., Hejmo, M. and Thomas, R.K. (2006) 'Robust cooperative trust establishment for manets', *Proceedings of the Fourth ACM Workshop on Security of Ad Hoc and Sensor Networks*, ACM Press, pp.23–34.