

# The Buck Stops Here: Trust Management in Multi-Agent Systems with Accountability

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## Abstract

*Much of security in multi-agent systems is based on models where each agent declares limits on what other agents are permitted to receive. Traditional systems are engineered to operate without violating their agents' cumulative declared constraints [14, 16].*

*In contrast, here we consider a trust model that is suited for use by ensembles of closely coupled agents operating in a system supporting agent accountability using audit trails for information flows. In such systems, an agent does not require enforcement of absolute limits on the what other agents receive, but instead seeks assurance that its personal liabilities will never exceed its declared risk tolerance. In short, each agent expects the system to behave in a manner which respects its declared accountability constraints—quantitative limits on what the agent agrees to be held accountable for sending.*

*This paper outlines a suite of protocols with which a multi-agent system can fulfill the cumulative accountability constraints of its constituent agents, and avoid subjecting any individual agent to greater liability than its declared risk tolerance. The protocols are shown to be efficient in a dynamic network setting, and are analyzed under a comprehensive set of failure models including link delay, link failure, and limited corruption in the control and data processing logic of agents.*

## 1. Introduction

Traditionally, agent security has been approached at the microscopic scale, as a problem of reconciling *pairwise* inter-agent trust with the rendering of agent services [7, 13]. This work, in contrast, considers agent security at macroscopic scales, as a problem of dynamic data filtering in

ensembles of cooperating agents [11] within a multi-agent system.

We consider a collection of agents  $V$ , cooperating by communicating over a dynamic network of logical connections  $E \subset V \times V$ . Within the agent network we assume that each datagram  $p$  is tagged with an immutable *sensitivity* classification, represented by an  $m$ -vector  $\bar{\sigma}(p)$  of real values [12]. We shall define a partial order on sensitivity as follows: given two  $m$ -vectors  $\bar{\sigma}, \bar{\sigma}'$  in  $\mathbb{R}^m$ , we write  $\bar{\sigma} \leq \bar{\sigma}'$  if the corresponding ordering holds in *all*  $m$  coordinates of  $\bar{\sigma}$  and  $\bar{\sigma}'$ . Larger sensitivity values implicitly mandate greater restrictions on the distribution of a packet.

In multi-agent systems which provide security contracts restricting the content of information flowing *to* individual agents, one interpretation of trust might be to associate with each agent  $w$ , the maximum sensitivity of information—say  $\tau_1(w)$ —that agent  $w$  is permitted to *receive* [17]. However, such a model implies that there is global consensus on  $\tau_1$ —clearly an unreasonable assumption for a dynamic large-scale open multi-agent system. To support interpretation of trust that permits disagreement on trust levels, we could model trust using a pairwise function  $\tau_2$ , where  $\tau_2(v, w)$  specifies the maximum sensitivity of information that agent  $v$  wants agent  $w$  to *ever receive*. A priori, this model appears to be more flexible, but it is easy to see that a system that satisfies constraints of the second type of model is equivalent to a system based on the first type of model—where for each agent  $w$ ,  $\tau_1(w)$  has been taken to be  $\min\{\tau_2(v, w) \mid v \in V\}$ . In the dynamic setting then, the difference between the two models amounts to nothing more than maintaining a distributed consensus on the values of  $\tau_1$  in terms of the values  $\tau_2$ . In short, the expressive power of the two trust models is equivalent—no additional flexibility is gained by adopting a pairwise trust function  $\tau_2$ .

In this paper, we consider a trust model that is suited to open multi-agent systems supporting auditing and accounting of information flows [1, 5, 15].

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is a procedure to for agents to adjust their contextual-accountabilities, even in the presence of dynamic local-accountabilities and a dynamic agent network topology. Finally, we augmented the protocols to withstand fail-stop crashes of agents and total failures of links. We gave a synopsis of possible phenomena that can occur in situations of agent corruption.

Our present software development efforts [8, 9, 10] extend earlier initiatives seeking to harness mobile agents for network management [3, 4, 6] and general information management [2]. In our mobile agent framework, we incrementally construct networks of agents by dragging them from a palette onto a canvas and connecting agents together into a directed graph. We want the agents to decide the sensitivity level of information that flows from producers to consumers and we want them to adjust their contextual-accountability functions so that the system as a whole satisfies accountability-based trust constraints. The protocols described here have been successfully used in the context of our software.

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