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**ARTICLE**





# **Trust Score-Based Malicious Vehicle Detection Scheme in Vehicular Network Environments**

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## <span id="page-0-2"></span>**ABSTRACT**

Advancements in the vehicular network technology enable real-time interconnection, data sharing, and intelligent cooperative driving among vehicles. However, malicious vehicles providing illegal and incorrect information can compromise the interests of vehicle users. Trust mechanisms serve as an effective solution to this issue. In recent years, many researchers have incorporated blockchain technology to manage and incentivize vehicle nodes, incurring significant overhead and storage requirements due to the frequent ingress and egress of vehicles within the area. In this paper, we propose a distributed vehicular network scheme based on trust scores. Specifically, the designed architecture partitions multiple vehicle regions into clusters. Then, cloud supervision systems (CSSs) verify the accuracy of the information transmitted by vehicles. Additionally, the trust scores for vehicles are calculated to reward or penalize them based on the trust evaluation model. Our proposed scheme demonstrates good scalability and effectively addresses the main cause of malicious information distribution among vehicles. Both theoretical and experimental analysis show that our scheme outperforms the compared schemes.

## **KEYWORDS**

Distributed; trust mechanism; vehicular network; privacy protection

## **1 Introduction**

Vehicular network represents a fusion of real-time sensing, communication, and computation that transcends their role as mere transportation. From a consumer's perspective, they resemble scintillating electronic to in the field of consumer electronics. As a novel paradigm of network application, it has emerged as a focal point of widespread attention and research. Particularly, the advent of 5G technology has ushered in significant transformations and developmental opportunities in this area [\[1\]](#page-25-0). By leveraging advanced on-board units equipped with superior sensing, communication, and networking capabilities, vehicles can establish communication links with neighboring vehicles or infrastructures. This enables the widespread dissemination of traffic information [\[2\]](#page-25-1). Not only does this convergence of in-vehicle networks improve driving safety and efficiency, but it also revolutionizes urban transportation systems through intelligent traffic management.



Despite offering significant convenience, vehicular networking presents numerous challenges, particularly in security and privacy protection. First, vehicles face difficulties in quickly verifying the accuracy of the shared information. In the event that malicious vehicles deliberately transmit misinformation, the implications may be severe, even endangering drivers' life. Consequently, it is critical for vehicles to develop a mechanism to monitor and control malicious activities of vehicles [\[3\]](#page-26-0). Simultaneously, trust issues arise in communication and collaboration between vehicles. Thus, it is imperative to establish a reliable trust system among devices to prevent malicious device attacks [\[4\]](#page-26-1). Additionally, vehicular networks must meet requirements for real-time response, reliability, and scalability to navigate the complex and dynamic traffic conditions [\[5\]](#page-26-2).

In order to actualize the detection of malicious vehicles, researchers have proposed solutions involving algorithmic models, cryptographic techniques, and identity verification. For example, by dynamically collaborating with the vehicle and the surrounding roadside units, and employing sequential detection algorithms, the accuracy of malicious vehicle identification is enhanced [\[6\]](#page-26-3). Building on this, some scholars introduced the Evolutionary Public Goods Game (EPGG) model to detect malicious information. Additionally, a countermeasure against such malicious information is implemented through broadcasting anti-malicious rumor information [\[7\]](#page-26-4). To address the potential cross-domain issues in the transmission and sharing of vehicular network data across different regions, a federated detection hierarchical mechanism is proposed. This mechanism facilitates a unified evaluation among devices, expedites identity authentication, and increases the detection accuracy of malicious devices [\[8\]](#page-26-5). However, the blockchain in this scheme, aimed at constructing a trust platform, suffers from low detection efficiency and limited scalability. Consequently, it is unsuitable for vehicular network scenarios that require high real-time performance.

In response to the aforementioned issues, this paper proposes an effective trust evaluation mechanism for distributed vehicular networks. This mechanism is intended to counteract the malicious behavior of vehicles spreading misleading messages. Our main contributions are summarized as follows:

(1) We employ a trust aggregation approach, coupled with a trust evaluation model, to calculate initial trust scores for vehicles. Subsequently, we thoroughly analyze vehicle data to refine the trust scores of each vehicle, thereby assessing their credibility. Finally, we introduce cloud supervision systems (CSSs) to verify the authenticity of the information transmitted by vehicles. Malicious vehicles spreading misleading information will be punished, whereas honest vehicles will gain bonus points, thus enhancing the system's environmental credibility.

(2) To enhance the robustness of the trust mechanism in vehicular networks, we propose a distributed architecture comprising the trusted authority institution (TAI) and CSSs. Among them, TAI is the core node which manages and coordinates the trust evaluation process, CSSs manages system-wide trust evaluation, process addressing various scenarios and requirements. This setup promotes labor division, cooperation, and performance optimization.

(3) To efficiently utilize the resource characteristics of CSSs, we introduce a heartbeat mechanism for their scheduling and load balancing. Through this mechanism, CSSs are allowed to periodically transmit their availability information to TAI, which can then make scheduling decisions for each CSS's resources. This achieves optimal load balancing and enhances system performance.

The rest of this paper is organized as follows. [Section 2](#page-2-0) introduces the related work. The system and attack model are presented in [Section 3.](#page-3-0) [Section 4](#page-5-0) details the specific scheme. A safety proof and analysis are performed in [Section 5.](#page-12-0) An overview of performance evaluation is provided in [Section 6.](#page-14-0) [Section 7](#page-24-0) discusses the feasibility and limitations of the proposed scheme. Finally, [Section 8](#page-25-2) concludes the paper.

#### <span id="page-2-0"></span>**2 Related Work**

## A. Applications of Trust Management Mechanism

Faced with a growing number of vehicles and diverse service demands, both academia and business are striving to promulgate novel paradigms to enhance road safety by transmitting traffic information via vehicles. Concurrently, a trust management mechanism has emerged as a key solution to prevent malevolent vehicles from spreading false information and harming the system. This mechanism could include three trust models: a Context and Entity-oriented Trust Model [\[9,](#page-26-6)[10\]](#page-26-7), a Data-oriented Trust Model [\[11\]](#page-26-8), and a Combined Trust Model [\[12\]](#page-26-9). Furthermore, deploying a reputation management mechanism can help establish trust relationships amongst vehicles [\[13\]](#page-26-10). Based on this concept, Tian et al. [\[14\]](#page-26-11) devised a reputation-based architecture, wherein vehicles are necessitated to invest money in reporting accurate traffic events to gain reputation scores. However, this scheme has been identified to have two deficiencies. First, the centralization poses a significant challenge [\[15\]](#page-26-12). Without trustworthy Roadside Units (RSUs), the reliance solely on a single central server for traffic information verification risks system paralysis from potential attacks. Trust aggregation through different network paths can help to consolidate a single trust value, enhancing reliability [\[16\]](#page-26-13). Therefore, designing a more secure and reliable communication mechanism is crucial to ensure the system's overall reliability and security. Simultaneously, it is necessary to ascertain how to establish a trustworthy interaction mechanism among vehicles to mitigate malicious behavior more effectively. In summary, trust management mechanisms are pivotal for maintaining the integrity and reliability of vehicular networks.

## B. Applications of Blockchain Technology

Considering the centralization dilemmas mentioned above, many academics have explored the blockchain technology as a prospective solution  $[15,17-19]$  $[15,17-19]$  $[15,17-19]$ . In addition, researchers have effectively deployed consortium blockchain to enhance security and privacy in vehicular network information dissemination. For instance, Kang et al. [\[19\]](#page-26-15) introduced a secure sharing framework based on the consortium blockchain and smart contract technologies. This approach employs a tri-weight subjective logic model to elect data sources, enhancing the credibility of the disseminated data. Chen et al. [\[20\]](#page-26-16) introduced a trust computation methodology based on collaborative filtering. Using this technique, they considered inter-vehicular interactions and historical data to accurately infer and evaluate trust values, thus enhancing the credibility of the information dissemination. Javaid et al. [\[21\]](#page-26-17) have employed physical unclonable functions (PUF) and certificates in blockchain protocols, facilitating faster trust management among vehicles. Zhang et al. [\[22\]](#page-27-0) then established a blockchain-based trust management mechanism to preserve vehicular reputation values. This research enhanced inter-vehicular trust management, bolstering secure information dissemination in vehicular networks. Furthermore, provided by these studies is a solid theoretical foundation and practical guidance for security and trust management in Telematics, which not only demonstrate the potential of blockchain technology in addressing the problems traditional to the field but also experimentally prove its effectiveness in enhancing the security and trustworthiness of data. Yang et al. [\[23\]](#page-27-1) suggested a decentralized trust management system using Bayesian inference models to validate information, further supporting secure communication. El-Sayed et al. [\[24\]](#page-27-2) estimated trustworthiness among vehicular entities using a hybrid trust model, ensuring secure and reliable information exchange. Collectively, these studies underscore the potential of blockchain technology in fortifying the security and trustworthiness of vehicular networks.

C. Challenges to Blockchain Technology

Due to its enhanced efficiency and reduced costs, consortium blockchain emerges as a superior choice for scenarios requiring secure vehicular data sharing. Cui et al. [\[18\]](#page-26-18) introduced a consortium blockchain-based scheme for secure vehicular data sharing, which facilitates efficient traceability and reliable information sharing. They also conceptualized a consensus algorithm based on a trust score model, aimed at improving the quality and reliability of the shared data. Despite the blockchain's significant advantages, such as secure vehicular data sharing and effective mitigation of information tampering [\[18–](#page-26-18)[20](#page-26-16)[,22\]](#page-27-0), its immutable mechanism poses challenges. Once data has been appended to a block, altering or removing it becomes difficult. This issue could potentially arise in situations such as erroneous data entry or unintended disclosure of confidential information. Furthermore, blockchain nodes are required to store substantial data, leading to high storage demands and latency issues [\[25\]](#page-27-3). This is particularly essential in vehicular networks, where vehicles constantly generate and exchange data. Utilizing blockchain technology for data processing could potentially affect the network's stability and latency [\[26\]](#page-27-4). Qiao et al. [\[27\]](#page-27-5) emphasized the importance of evaluating both direct and indirect trust, proposing a combined trust evaluation model involving edge servers and data users to improve trust assessment accuracy. Therefore, while blockchain offers promising solutions, its implementation in vehicular networks requires careful consideration of these challenges.

To address the issues outlined above, this paper proposes a trust aggregation authentication scheme, through a trust scoring system model for vehicles. The scheme tackles malicious vehicles dissemination, the single point of failure in centralized trust models, and the high communication and storage overhead in blockchain-based vehicular networks.

## <span id="page-3-0"></span>**3 System Model and Attack Model**

## *3.1 System Model*

The proposed model for preserving vehicular privacy through a trust-score system is depicted in [Fig. 1.](#page-4-0) It is composed of CSSs arrays, TAI, RSUs, and Vehicles (V). The roles of each component are explained below:

## **CSSs:**

They are primarily responsible for monitoring traffic conditions in real-time and collating relevant information. In practice, this responsibility is delegated to the camera-based traffic monitoring system. Leveraging advanced sensors and communication devices, CSSs can capture complex vehicular motion parameters such as location, velocity, and acceleration. CSSs are fully trusted entities capable of withstanding various attacks. They possess ample storage resources and computational power, enabling them to monitor vehicular information promptly and accurately. This capability ensures that traffic conditions are continuously monitored, and relevant data is reliably collected and processed in real-time.

## **TAI:**

This component consists of official entities such as government transportation departments. Its duties include generating public-private key pairs, issuing public keys, and registering vehicular identity information. When a vehicle detects malicious behavior from another, it can report this to the TAI. Subsequently, TAI conducts an initial screening and verification of the reported information before collaborating with CSS to verify the accuracy and timeliness of the information.



**Figure 1:** System model

#### <span id="page-4-0"></span>**V:**

They are equipped with communication devices, including Dedicated Short Range Communication (DSRC) and Wireless Access for Vehicular Environment (WAVE), which facilitate communication with their surroundings [\[28\]](#page-27-6). These devices can receive and transmit data such as the vehicle's location, velocity, direction, road conditions, and traffic signals. These data provide essential information about the vehicle's status and the environmental conditions. Simultaneously, each vehicle incorporates an On-Board Unit (OBU) that serves as the central controller, interfacing with the Electronic Control Unit (ECU) to manage and control the vehicle's operations.

## **RSUs:**

They are wireless communication devices engineered to enhance intelligent transportation systems. They enable bidirectional data exchange with Cluster Head Vehicles (CHVs), solely relaying CHVs' information to the TAI. In our scheme, different regions are divided by various RSUs, with interactions between regions conducted through CHVs. The formation of these regions generally utilizes scalable clustering algorithms [\[29\]](#page-27-7). It is noteworthy that the selection of clustering algorithms is not the focus of this paper. If you are interested in this topic, you can refer to References [\[30–](#page-27-8) [33\]](#page-27-9). Vehicles entering a new region cannot access information from their previous region or the historical data of the new region, ensuring data security. This facilitates the identity verification of vehicles and data encryption without storing any personal information of the users or participate in the authentication operation. Moreover, it functions solely as a relay node. This fundamentally eliminates the risk of crucial data breaches, thus safeguarding the privacy and security of vehicle users.

#### *3.2 Attack Model*

The wireless interaction between V and CSS poses the risk of interception by malicious entities. These attackers may exploit vulnerabilities to steal, manipulate, or engage in impersonation and replay attacks. To address this risk, we employ the established Canetti and Krawczyk's adversary model (CK-adversary model) [\[34\]](#page-27-10) as our threat framework. Specifically, in this study, RSU serve solely as intermediaries for message forwarding, without engaging in message storage; the TAI acts as the authenticating body for messages between V and CSS. We make the assumption that both RSUs and TAI are reliable.

## *3.3 Security Assumption*

The distributed vehicle system model based on trust scoring proposed in this paper must be resistant to various malicious attacks while maintaining reliable performance. The specific requirements are as follows:

(1) *Anonymity*: It is required to prevent other entities from recognizing the true identity of the vehicle user. Thus, it is necessary to effectively encrypt the identity of the vehicle user during the interaction process to ensure that his or her identity is not compromised.

(2) *Traceability*: In vehicular communication systems, vehicles exchange information to enable functions such as real-time traffic information sharing and real-time road condition monitoring. To ensure the source and authenticity of the messages, it is crucial that messages sent by vehicles are traceable. Failure to trace messages can pose a potential threat to traffic safety.

(3) *Mutual Authentication*: It refers to the bidirectional identity verification between vehicles, which aims to confirm the identity and legitimacy of the communicating vehicles. This helps prevent the intrusion and attacks from malicious entities, and ensures communication only with authorized vehicles.

(4) *Resistance to Data Replay Attack*: It occurs when an attacker intercepts and replays legitimate vehicle control commands, leading to misleading and potentially dangerous vehicle operations. Furthermore, the attacker can manipulate location information and road condition data, disrupting the cooperative work and decision-making processes of the vehicle network, and potentially resulting in a chaotic vehicle network system. To mitigate this attack, the inter-entity interaction verification is employed in this paper.

(5) *Timed Heartbeat Mechanism and Pull Services*: To maximize utility, CSS entities are scheduled to send availability messages to TAI before a vehicle sends a request. Additionally, TAI is scheduled to pull the list of CSS services to verify their availability.

#### <span id="page-5-0"></span>**4 The Proposed Scheme**

#### *4.1 System Overview*

In this section, we will introduce the proposed scheme from four phases: 1) System initialization phase; 2) Registration phase; 3) User login phase; and 4) Trust score update phase. [Table 1](#page-6-0) shows the notations of the proposed scheme.

#### *4.2 System Initialization Phase*

In this phase, the  $TAI_i$  selects a prime additive cyclic group *G*, where the operation of  $G \times G = G^i$ , and the order is denoted as *P*. *TAI<sub>i</sub>* generates a public-private key pair  $(S_i, P_i)$  where  $P_i = S_i P$  and  $S_i$  is a randomly generated private key. Then, it generates two secure hash functions,  $H_1: \{0,1\}^* \to \{0,1\}^*$ , and  $H: \{0, 1\}^* \to G^{\nu}$ . *TAI<sub>i</sub>* exposes system parameters  $\{H_1, H, P_i, P\}$ .

<span id="page-6-0"></span>

Notation	Description
$\mathbf{CSS}_i$	Node of the $i-th$ Cloud supervision system
$TAI_i$	The $i-th$ trusted institution node
$P_i/S_i$	Public/Private Key of $TAI_i$
$C_{\scriptscriptstyle{pub}_i}$	Public Key of the $i-th$ vehicle
$C_{\text{pri}_i}$	Private Key of the $i-th$ vehicle
$UID_i$	Real identity of $User_i$
$AID_i$	Anonymous identity of $User_i$
$VID_i$	Real identity of $V_i$
$\boldsymbol{CID}$	Real identity of $CSS_i$
$UPW_i$	The password of $User_i$
$V_i$	The $i-th$ vehicle
$CT_i$	The current timestamp
$\triangle CT$	Maximum threshold for timestamp validity
$H, H_1$	Two one-way hash functions
r, s, t, u, v	Random numbers
$\oplus,  $	Exclusive OR and concatenation operation
$TS_i$	Trust scores of $V_i$
$r_i$	The $i-th$ cluster head vehicle request message
<b>TTS</b>	The threshold for the trust score is equal to 69
<b>VNUM</b>	Number of vehicles reported
$CHV_i$	The $i-th$ cluster head vehicle
LTV/HTV	Lower/Upper threshold value for the number of vehicles reported
<i>RTE/PTE</i>	Reward/Penalty trust score threshold

**Table 1:** Notations

## *4.3 Registration Phase*

To participate in the trusted traffic system,  $V_i$  and  $CSS_i$  must register and establish secure communication with *TAI<sub>i</sub>* to obtain authorizations and certificates. Upon successful registration, the *TAI<sub>i</sub>* verifies the credentials and issues digital certificates to ensure secure and authenticated interactions within the vehicular network.

#### *4.3.1 Vehicles Registration*

Registration of the vehicle is essential for accessing various services and ensuring personal safety. [Fig. 2](#page-7-0) schematically represents the vehicle registration process.

(1) Initially, the user *User<sub>i</sub>* is required to provide a unique identity identifier  $UID_i$  to  $TAI_i$ . Concurrently, *User<sub>i</sub>* randomly selects a password *UPW<sub>i</sub>*, and computes  $RIW_i = H_1 (UID_i \oplus UPW_i)$ . Afterward, Subsequently, *User<sub>i</sub>* sends  $TAI_i$  both  $UID_i$  and  $RIW_i$  through the vehicle for identity verification.

(2) Upon receiving the parameters, *TAIi* first queries the backend data via *UIDi* to determine whether the current user's vehicle is registered. For a new user, *TAIi* generates a random number *si*, and calculates  $A_i = R I W_i \oplus H(V I D_i || s_i)$ . Then, it sends  $\{A_i, H_1, H\}$  to the vehicle user, stores them in the vehicle system, and generates a public-private key pair. The user *Useri* then generates a unique random number r, computes  $K_i = P_i * (AID_i \oplus RIW_i) ||r, Q_i = K_i \oplus RIW_i, B_i = P_i * H_1(RIW_i||VID_i||K_i),$ and stores  $\{B_i, O_i\}$  in the vehicle storage's unit.



**Figure 2:** Vehicle registration phase

## <span id="page-7-0"></span>*4.3.2 Cloud Supervision System Registration*

[Fig. 3](#page-7-1) depicts the interaction process between the CSS and TAI. Each service provider in CSS, identified as *CSSi*, is required to register with *TAIi* by submitting its identity information and relevant credentials for verification and storage.

(1) *CSSi* initially employs the pseudo random number generator (PRNG) algorithm [\[35\]](#page-27-11) to generate random numbers *u*, *CID<sub>i</sub>*, and  $x_i$ . Subsequently, it computes  $D_i = H_1 (CID_i \oplus u)$ , and transmits the parameter *Di* to *TAIi*.

(2) After receiving the parameters from *CSSi*, *TAIi* generates a random number *v* that is independent and unpredictable. Then, it computes  $E_i = D_i \oplus v$ ,  $E_i = \alpha_i P$ , where  $\alpha_i$  is a random number generated by  $TAI_i$ . Afterwards it sends  $E_i$  and  $U_i$  to  $CSS_i$ , and stores  $\{E_i, U_i\}$  in a secure database.

Css		TAI
(1) Choose a unique random number $u$ , $CID_i$ , $x_i$ Compute $D_i = H_i(CID_i \oplus u)$	$(2)\{D_i\}$	$(3)$ generate a random $\nu$ Compute $E_i = D_i \oplus v$ $U_i = \alpha_i P$
$(5)$ Store $E_i, U_i$	$(4)\{E_{i},U_{j}\}$	

**Figure 3:** Cloud supervision system registration phase

#### <span id="page-7-1"></span>*4.4 User Login Phase*

[Fig. 4](#page-8-0) illustrates the steps for a user to log into the vehicle system. This process ensures the legitimacy of the user's identity and the system's security.

(1) *User<sub>i</sub>* inputs his or her name and password. Next, he sends  $\{UID_i, UPW_i\}$  to the  $V_i$ .

(2) After receiving the message from *Useri*, the vehicle verifies whether the entered password is correct. *V<sub>i</sub>* computes  $C_i = H_1 \left( \text{UID}_i \oplus \text{UPW}_i \right)$ ,  $K_i = C_i \oplus Q_i, B'_i = P_i * H_1 \left( C_i || \text{UPW}_i \right)$ , and compares it with  $B_i$ . If  $B'_i = B_i$ , then the user's login is successful and a verification success message is returned. Otherwise, the user's login fails, and a verification failure message is returned.



**Figure 4:** User login phase

## <span id="page-8-0"></span>*4.5 Trust Score Update Phase*

Legitimate vehicles send report information to *TAIi*, initially verifying the vehicle user's identity and then querying a specific CSS to validate the integrity of the information. A CSS node facilitates *TAI<sub>i</sub>* in adjusting its decision-making and response in real-time. Specifically, the CSS node processes and aggregates the received data, performing an initial integrity check before forwarding it to *TAIi* for a more comprehensive analysis. Users' information is encrypted for security. Upon decryption, *TAIi* audits each CSS node to ensure the provision of service, analyzing node performance, availability, and load conditions.

## *4.5.1 Inter Vehicle Authentication and Key Agreement*

(1) First, the vehicles are required to establish initial trust by exchanging messages (*mi*) and establishing a session key  $[26]$ . The vehicles,  $v_i$  and  $v_j$ , assess and score each other's messages before forwarding them to  $CHV<sub>i</sub>$ . Here, the  $CHV<sub>i</sub>$  is elected through the evaluation of trust scores from vehicles in the domain at predetermined intervals. Any vehicle within a certain area of the RSU may be elected as a cluster head vehicle. This process is shown in [Fig. 5.](#page-8-1)



<span id="page-8-1"></span>

(2) To be specific,  $v_i$  calculates  $RIW_i = H_1 (UID_i \oplus UPW_i)$  and encrypts it using  $v_i$ 's public key  $C_{pub_j}$ . Then,  $v_i$  sends the parameter  $\{RIW_i, M_i, CT_i, C_{pub_j}\}$  to  $v_j$ . After receiving the message from  $v_i, v_j$ decrypts it with his private key to assess its correctness, score *vi*, and rank trust scores of vehicles in the domain. The scoring information are then sent to *CHVi*, the vehicle with the highest trust score in the domain. *CHV<sub>i</sub>* forwards the scored distribution to  $v_i$  and stores it. Similarly,  $v_i$  establishes a session key with  $v_i$  in the same manner.

(3) The delivery rate (*DR*) [\[36\]](#page-27-12), effective propagation rate (*EPR*), and safety-distance information rate (*SDIR*) [\[37\]](#page-27-13) are the three key metrics used to calculate a vehicle's trust score. The higher these three metrics are, the more reliable the vehicle is and the higher the score. Conversely, vehicles with low metrics are indicative of serious transmission failures during data transmission. Therefore, the trust level of the affected vehicle should be adjusted downwards to reflect its decreased reliability.

#### *4.5.2 Trust Score Update*

In the initialization phase, vehicles obtain initial trust through mutual interactions and historical behavior information. To accurately evaluate the trustworthiness of vehicles, our model employs three methods: *DR*, *EPR*, and *SDIR*. When a vehicle's malicious behavior is reported by another vehicle, the report is first preliminarily screened by the TAI and subsequently verified by the CSS. In this interaction, the CSS is responsible for validating the integrity of the report by comparing it with locally stored data and logs, and then sending its verification results back to TAI for final judgment. If the report is found to be accurate, the TAI rewards the reporting vehicle and penalizes the malicious vehicle by deducting trust points. Conversely, if the report is false and the reported vehicle was wrongly accused, the CSS verifies this, and the vehicle that was falsely accused is rewarded with trust points, while the malicious reporting vehicle is penalized.

(1) The vehicle trust may increase or decrease, depending on the vehicle's behavior of the vehicle. As illustrated in [Fig. 6,](#page-10-0) vehicle  $V_i$  first computes  $RIW_i = H_1 (UID_i \oplus UPW_i)$  and selects a random number *f<sub>i</sub>*. The *User<sub>i</sub>* verifies his identity by logging into the system using the pre-stored static parameters *UID<sub>i</sub>* and *UPW<sub>i</sub>*. Subsequently, the system calculates  $G_i = f_i P$ ,  $G_i^* = f_i P_i$ ,  $F_i = RIW_i \oplus I$  $G_i^* \oplus A_i$ , and  $M_i = H_1(VID_i||CT_i) \oplus r_i$ , respectively. To enhance the efficiency of transmitting vehicle report information and reduce communication overhead, the system utilizes *CHV<sub>i</sub>* as an intermediary node for transmitting the vehicle report information *ri*. Finally, the parameters *D*1 are sent to TAI via the network.

(2) Upon receiving the requested data from the vehicle,  $TAI_i$  calculates whether  $\Delta CT <$  $|CT_r - CT_i|$  to ensure the data's timeliness in generation or transmission. If  $CT_i$  is valid, *TAI<sub>i</sub>* decrypts the data from *V<sub>i</sub>* and computes  $G_i^* = S_i G_i$ . Then, it checks the validity of  $RIW_i = F_i \oplus G_i^* \oplus A_i$ . Since  $RIW_i$  is authenticated at registration, matching the received  $RIW_i$  demonstrates the validity of the equation, allowing  $TAI<sub>i</sub>$  to proceed with subsequent operations. After verification,  $TAI<sub>i</sub>$  encapsulates the validated data and associated parameters before securely transmitting parameters *D*2 to *CSSi* for further processing, ensuring that *CSS<sub>i</sub>* can accurately assess and aggregate the data for system-wide decisions.

(3) In Spring Cloud Netflix [\[38\]](#page-27-14), the registry Eureka [\[39\]](#page-27-15) is designed to ensure high service availability. In this paper, we adopt a similar approach, using *CSSi* as a registry to guarantee effective service provision. Through mutual registration, each  $CSS<sub>i</sub>$  maintains a registry list to track the availability of other *CSSi*. Periodically, *TAIi* queries the *CSSi* registry to check service availability. Unavailable services are removed from the  $CSS_i$  registry. Furthermore,  $CSS_i$  periodically sends heartbeats to  $TAI_i$ . If the heartbeat intervals exceed the specified threshold,  $CSS_i$  is marked as unavailable. To prevent premature removal, *TAIi* automatically activates the protection mechanism

#### CMC, 2024, vol.81, no.2 2527

based on the *CSSi* heartbeat ratio. Specifically, *TAIi* checks whether the heartbeat ratio of *CSSi* falls below the predefined threshold at regular interval. If the ratio meets the threshold,  $CSS_i$  remains in service.



**Figure 6:** Phase of updating trust scores

<span id="page-10-0"></span>

To ensure the high availability of *CSSi*, we utilize a round-robin load balancing algorithm (see Algorithm 1) to select the  $CSS_i$  service. Since the choice of load balancing algorithm is beyond the scope of this paper. To gain a deeper understanding, reference to the related literature [\[40–](#page-28-0)[43\]](#page-28-1) is recommended.

TAI determines the available services list *(CSS<sub>rList</sub>)* by analyzing the service registry and generates a new list (*CSSnRList*) of available services after applying using a load balancing algorithm **(***LB*) [\[41\]](#page-28-2). After evaluating the availability of each service, TAI updates the service renewal time (*TCSSi*) and increases the heartbeat count  $(CSS_{i_{hc}})$  if the service is available. If the service's heartbeat count and the number of TAI requests for CSS service availability (*CSS<sub>icount</sub>*) both exceed the threshold (*HVALUE*), the service is considered available. Otherwise, the service needs to be re-registered. Finally, the service is reordered and made available based on the weights and heartbeat times.

(4)  $CSS_i$  checks whether  $D_i$  is equal to  $E_i \oplus v$ . If it holds, then  $CSS_i$  is authenticated as a legally registered entity in *TAI<sub>i</sub>*. It proceeds to calculate the message  $r_i = M_i \oplus H_1(VID_i||CT_i)$ ,  $R_i = U_i v$ ,

 $M_i = H_1(VID_i||E_i) \oplus R_i \oplus p_i \oplus r_i$ , where  $p_i$  is a judgment message used by the CSS to verify the accuracy of the reported information from the vehicle, and the number of trust scores and reported vehicles that each vehicle needs to update. In this process, *CSSi* also evaluates the trustworthiness of the report based on data received from *TAIi*, ensuring that the information aligns with previously registered vehicle behavior. This evaluation is performed before generating and sending the final message, incorporating the trust analysis as part of its authentication workflow. Finally, *CSSj* transmits the computed message and parameters *D*3 back to *TAIi*.

(5)  $CSS_i$  sends parameters  $CT_i$  to  $TAI_i$ , who then checks whether the timestamp of the sent information is within the specified delay time. If it is valid, *TAI<sub>i</sub>* compute  $R_i = U_i v$ , and  $p_i =$  $H_1(VID_i||E_i) \oplus R_i \oplus M_i \oplus r_i$ . Subsequently, it judges whether the inequality  $TS_i > TTS$  holds, where *TSi* represents the trust scores of all reporting vehicles. If this condition holds, it indicates that the trust score of the reporting vehicle exceeds the specified threshold. It also checks whether  $VNUM \geq LTV$ holds. If true, this indicates that *VNUM*, the number of reporting vehicles exceeding the trust score threshold, meets or exceeds the minimum threshold. If any condition is not met, it judges whether  $TS_i \leq TTS$  and *VNUM*  $\geq HTV$  hold. These conditions indicate that the trust score of the reporting vehicle is at most equal to the specified threshold and the number of reporting vehicles exceed the maximum threshold. If the number of reporting vehicles and the trust score meet the above judgments, reporting is allowed; otherwise, it is not. Subsequently, *TAIi* rewards or penalizes the reporting and reported vehicles based on the accuracy of the message from *CSSi*. If the report information is true, *TAI<sub>i</sub>* applies the equation  $TS_i = TS_i + RTE$  to reward the reporting vehicle, and calculates *TS<sub>i</sub>* = *TS<sub>i</sub>* − *PTE* to penalize the reported vehicle that spreads malicious information. Otherwise, it penalizes the reporting vehicle and rewards the reported one for spreading correct information, using trust score measures. Finally, *TAI<sub>i</sub>* computes  $M_i = H(A_i \oplus G_i) \oplus q_i$ , where  $q_i$  includes scores of reporting and reported vehicle entities, as well as the relevant reporting data of vehicles.

**Algorithm 2:** Vehicle rewards and punishments

 $\textbf{Input:} \ \ \textbf{Calculate} \ \textbf{the \ initial \ trust scores:} \left\{ TS_{\textit{Initial}_1}, TS_{\textit{Initial}_2}, \cdots, TS_{\textit{Initial}_i}, \cdots, TS_{\textit{Initial}_k} \right\}$ **Output:**  $TS = \{TS_1, TS_2, \cdots, TS_i, \cdots, TS_k\}$ 1:  $CHV_i$  = *scheduledSort*( $TS_1, TS_2, \cdots, TS_i, \cdots, TS_n$ ) 2:  $V_i \rightarrow TS_{V_j}$  to  $CHV_i$ ,  $CHV_i$  compute  $TS_{Initial_j}$  + =  $RTE$  or  $TS_{Initial_j}$  − =  $PTE$ ;  $V_j \rightarrow TS_{V_i}$  *to CHV<sub>i</sub>*, *CHV<sub>j</sub>* compute  $TS_{Initial_i} + = RTE$  or  $TS_{Initial_i} - = PTE$ 3:  $TS_i = TS_{\text{Initial}_i}, \quad TS_j = TS_{\text{Initial}_j}$ 4:  $m_i = \text{report } V(V_1, V_2, \cdots, V_i, V_i) \rightarrow CHV_i$ 5:  $CHV_i \rightarrow TAI_i, TAI_i \rightarrow CSS_i$ 6:  $CSS_i$ : **Check**  $m_i$  is True or False **then**  $\rightarrow TAI_i$ 7: *TAIi* : compute **for**  $(i = 0, i < rtV_{\nu_i}$ . **length**,  $i + +)$ 8: **if**  $(rtV_{\nu_i}.TS_i > TTS\&\&VNUM \geq LTV)$ 9: **if** $(rtV_{\nu_i}$  is True and  $rtedV_{\nu_i}$  is False)  $TS_{rtV_{\nu_i}} += RTE, TS_{retV_{\nu_i}} - = PTE$ 10: **else if** $(rtV_{v_i}$  is False and  $rtedV_{v_i}$  is True)  $TS_{rtV_{v_i}} - PTE$ ,  $TS_{rtedV_{v_i}} + RTE$ 11: **end if** 12: **else if**  $(rtV_{\nu_i}.TS_i \leq TTS\&\&VNUM > HTV)$ 13: **if**  $(rtV_{v_i}$  is True and  $rtedV_{v_i}$  is False)  $TS_{rtV_{v_i}} += RTE$ ,  $TS_{rdV_{v_i}} - = PTE$ 14: **else if** $(rtV_{v_i}$  *is* False and  $rtedV_{v_i}$  is True)  $TS_{rtV_{v_i}} - PTE$ ,  $TS_{rdV_{v_i}} + RTE$ 15: **else logger**.**info** ("Report Vehicle Lack of Confidence") (Continued)



Primarily, the initial trust scores (*TS<sub>Initial<sub>i</sub>*) of vehicles are computed using three indicators: *DR*,</sub> *EPR*, and *SDIR*. Vehicles  $V_i$  and  $V_j$  mutually assign scores, represented as  $TS_{V_j}$  and  $TS_{V_i}$ , respectively. Subsequently, *CHVi* periodically uses the *scheduledSort* function to select the RSU regional vehicle trust score (see Algorithm 2). Then,  $V_i$  and  $V_j$  each transmit their scores to  $CHV_i$  individually. Based on real road conditions,  $CHV_i$  uses  $TS_{\textit{Initial}_i} += RTE$  to increase the trust score for the vehicle transmitting information, and  $TS_{Initial_i}$  –  $PTE$  to decrease it.

Ultimately,  $CHV_i$  calculates  $TS_i = TS_{Initial_i}$ . Upon detecting malicious vehicles disseminating illegal information, multiple vehicles are required to report to  $CHV_i$  (*reportV*). Subsequently,  $CHV_i$ relays the information  $m_i$  to  $TAI_i$ . In each region divided by RSUs, a  $CHV_i$  can be selected to ensure security. When a vehicle enters a new region, it cannot access information from the previous region nor the historical data of the new region.

In Algorithm 2, the  $TAI_i$  transmits  $m_i$  to  $CSS_i$ .  $CSS_i$  assesses the accuracy of  $m_i$ , including the data from the reporting vehicle (*rtV<sub>vi</sub>*) and the reported vehicle (*rtedV<sub>v<sub>i</sub></sub>*), and then reports the results to *TAI<sub>i</sub>*. If the condition  $rtV_{\nu_i}$ .  $TS_i > TTS\&\&VNUM \geq LTV$  or  $rtV_{\nu_i}$ .  $TS_i \leq TTS\&\&VNUM > HTV$ is satisfied, *TAI<sub>i</sub>* adjusts the trust score based on the accuracy of the information from both vehicles, either as a reward or a penalty. If neither condition is met, indicating distrust, a "Report Vehicles Lack of Confidence" log is generated. In this case, the  $rtV_{v_i}$  needs to successfully report more instances, thus increasing its trust score.

(6) *TAIi* dispatches the calculated trust scores for the reporting and reported vehicles, along with the current timestamp, to the  $CHV_i$ .  $CHV_i$  checks whether  $\Delta CT < |CT_i - CT_i|$  holds, and then computes  $q_i = H(A_i \oplus G_i) \oplus M_i$ . Before this,  $T A I_i$  retrieves the necessary context from the CSS, including any relevant cluster information and authentication parameters, ensuring the calculation of accurate trust scores. Finally,  $CHV_i$  transmits the trust score to the corresponding  $V_i$ , for storage in the vehicle system. It should be noted that, upon reelection of  $CHV<sub>i</sub>$ , the trust score of the associated vehicle is synchronized with the latest cluster head vehicle, and locally stored trust scores of other vehicles are deleted. This process safeguards the vehicle's security.

#### <span id="page-12-0"></span>**5 Security Proof and Analysis**

This section mainly analyzes and proves the security of the proposed authentication scheme.

#### *5.1 Security Proof*

#### *5.1.1 Security Model*

To ensure secure interactions between V and CSS, we have developed a robust security model. Our goal is to ensure the system's reliability and confidentiality. The model involves three entities: V, CSS, and TAI. We denote their arbitrary instances as  $V_a$ ,  $CSS_b$ , and  $TAI_c$ . Given that [Section 3](#page-3-0) explicitly establishes TAI's absolute security and RSU's role as a mere forwarder (without information storage), we exclude them as potential threats in our analysis.

(1) *AKA Request*: In this scenario, adversary (*A*) intercepts the information exchanged during the authentication and key negotiation phase among entities  $V_a$ ,  $CSS_b$ , and  $TAI_c$ . This process is vulnerable to a potential security threat of eavesdropping, as *A* attempts to listen to on the communication between  $V_a$ ,  $CSS_b$ , and  $TAI_c$ . At this juncture, challenger (*C*) responds by generating pseudo-data of equivalent size.

(2) *Indirect Request*: During this communication, *A* attempts to intercept and manipulate the message between the parties. In response to this tampering threat, *C* promptly addresses the situation by replying within the same context.

(3) *Private Key Request*: In the context of a communication session, *A* initiates a request to query the session key shared among participating entities. Upon the session's completion, *C* securely transmits the session key to *A* by encrypting the message, and then intercepting a portion of the encrypted transmission.

(4) *Test Request*: *A* initiates a query to retrieve interaction information. In response, *C* assesses the information's freshness based on the timestamp and validates it through entity encryption. Finally, *C* returns the appropriately formatted information.

**Definition1:** Considering the assumption that the successful outcome of *A* in the game is a polynomial-time problem (PPT), we can conclude that our proposed scheme is deemed to possess absolute security.

**Definition2:** If the interaction among  $V_a$ ,  $CSS_b$ , and  $TAI_c$  meets the requirement for the initial session visit within the specified short timestamp, and if it is computationally challenging to derive the interaction information using DHP, we additionally employ encryption or pseudorandom data generation to ensure the security of our proposed scheme.

#### *5.1.2 Security Proof*

The scheme proposed in this paper relies on Diffie-Hellman Challenge (DCH) and Diffie-Hellman Problem (DHP), as below:

**Theorem:** In response to *A'*s parameterized request attack, our scheme utilizes the approach of creating pseudo-data resembling the original and validating freshness, thereby guaranteeing the scheme's efficacy.

**Proof:** To assess the security of our proposed scheme, we introduce a game between challengers *C* and opponents *A*. It is crucial to evaluate any potential vulnerabilities If *A* can compromise our scheme. During the game, *A* may initiate the following requests:

**Initialization:** *C* Setup List: *List*<sub>1</sub> = { $RIW_i, m_i, C_{pub_i}, S_{pri_i}$ }, *List*<sub>2</sub> = { $A_i, CIW_i, RIW_i$ }, *List*<sub>3</sub> =  $\{VID_i, M_i, v, e, CT_i\}$ , *List*<sub>4</sub> =  $\{CT_i, RIW_i\}$ , *and List*<sub>5</sub> =  $\{P_i, G_i, r\}$ . In this phase, *C* initializes all of the aforementioned lists with empty values.

(1) *AKA Request*: When *A* seeks to inquire about the messages  $(M_1, M_2, M_3, M_i)$  exchanged between  $V_a$ ,  $CSS_b$ , and  $TAI_c$ , C then generates random data of equivalent size to the message. Subsequently, *C* encrypts this random data by computing  $G_i$  and by  $P_i$ , storing it in *List*<sub>5</sub> before transmitting the message to *A*.

(2) *Indirect Request*: In the given context, *A* sends a request for  $M_i$  to  $TAI_c$ . Subsequently, *C* initially sends  $M_i$  to  $TAI_c$  by computing  $M_i = H_1(VID_i||CT_i) \oplus r_i$  and establishing the current timestamp. Following this, *C* sends *Mi* to *TAIc*.

(3) *Private Key Request*: When *A* makes a query with *RIWi*, *C* verifies the presence of  $(RIW_i, m_i, C_{pub_i}, S_{pri_i})$  in *List*<sub>4</sub>. If there exists a session key  $S_{pri_i}$  in *List*<sub>1</sub>, *C* computes  $H(S_{pri_i})$ , extracts

data with a byte size equivalent to  $S_{pri_i}$ , stores it in  $List_1$ , and subsequently sends the information back to *A*.

(4) *Test Request*: Upon receiving a request with  $CT<sub>i</sub>$  from A, C evaluates the freshness of the timestamp using formula  $\Delta CT$ ?  $\langle CT - CT \rangle$ . If the data is fresh, *C* then records the interaction information  $(M_1, M_2, M_3, M_i)$  between them. Subsequently, the equation  $G_i = f_i P$  is utilized for computation, and the resulting data is stored in *List<sub>5</sub>*. Finally, the data from *List<sub>5</sub>* ( $M_i$ ,  $CT_i$ ,  $G_i$ ) is transmitted to *A*.

#### *5.2 Security Analysis*

(1) *Anonymity*: In the vehicular network discussed in this paper, protecting the identity and password of vehicle users from potential theft is considered crucial. To achieve this objective, a hash function derived as  $RIW_i = H_i(UID_i \oplus UPW_i)$  is used to encrypt the user's identity and password during interactions with other entities.

(2) *Traceability*: The report message sent by each vehicle is attached with its unique identification *Vi*. When vehicles interact, they calculate unique encrypted information based on each vehicle's unique identity, ensuring the sender's identity and the message's traceability to *TAIi*. For each message, *CHVi* calculates  $M_i = H_1(VID_i||CT_i) \oplus r_i$ , records the sender, and transmits the message to  $TAI_i$ . These steps accurately identify vehicles during transmission, preventing tampering or impersonation.

(3) *Mutual authentication*: Messages from vehicle  $V_i$  to vehicle  $V_j$  are encrypted with  $V_i$ 's public key. Only *Vj*'s private key can decrypt these messages, ensuring data confidentiality and integrity. Similarly, vehicle *Vj* encrypts a message to *Vi* using similar methods. During trust score updates, vehicle *Vi* needs to compute  $G_i = f_i P$  and  $G_i^* = f_i P_i$ . Subsequently,  $T A I_i$  computes  $G_i^* = S_i G_i$ , and authenticates the identity of the vehicle user using  $RIW_i$ ? =  $F_i \oplus G_i^* \oplus A_i$ .

(4) *Resistance to data replay attack*: Timestamps are employed in interactions between entities. For instance, upon receiving a message, *TAI<sub>i</sub>* checks the verification of  $\Delta CT < |CT - CT_i|$ , and confirms that the generated random numbers are unique and unpredictable. This design is intended to enhance the system security and minimize the risk of data replay attacks.

(5) *Timed heartbeat mechanism and pull services*: *TAIi* periodically requests a list of reliable *CSSi* to ensure the system's overall security. This prevents  $CSS_i$  from crashing due to excessive data requests, which would otherwise hinder supervision of vehicle behaviors. Additionally, *CSS<sub>i</sub>* regularly sends available information to *TAIi* optimizing service utilization through a load balancing algorithm.

#### <span id="page-14-0"></span>**6 Performance Evaluation**

#### *6.1 Comparison of Computation Overhead*

In this subsection, we compare our proposed scheme with three alternative schemes to show its superior performance. Due to resource constraints, we conduct our tests using a personal computer (Lenovo, with an Intel(R) Core(TM) i9-12900H@ 2.50 GHz processor, 16 GB main memory, and the windows11 operation system) to serve as the platforms for the testing of three entities: Vehicle, TAI and CSS. Utilizing the renowned MIRACL library, we execute 5000 iterations of the operations and to obtain the average time required for each. Results are presented in [Table 2.](#page-15-0) The Montgomery curve scalar multiplication  $(T_{msm})$  is computationally faster than the Weierstrass curve scalar multiplication  $(T_{wm})$ . Consequently, we adopt the same scheme used in SMAKA [\[44\]](#page-28-3). The execution time of Exclusive OR and concatenation operations are negligible, and thus not addressed in this paper. Additionally, we present a comparative analysis of the computational overhead of our scheme and other schemes <span id="page-15-0"></span>in different scenarios in [Tables 3](#page-15-1)[–5.](#page-16-0) As other existing schemes [\[5](#page-26-2)[,44](#page-28-3)[,45\]](#page-28-4) closely resemble our proposed architecture, we will solely focus on discussing our proposed scheme in the following subsections.

Symbol	Description	Time (ms)
$T_{\scriptscriptstyle{uh}}$	Unidirectional hash arithmetic	0.0012
$T_{\tiny\textit{wsm}}$	Weierstrass curve scale multiplication in ECC	0.4190
$T_{\rm\scriptscriptstyle msm}$	Montgomery curve scale multiplication in ECC	0.1790
$T_{\mathrm{\scriptscriptstyle sed}}$	Symmetric encryption/decryption	0.0212
$T_{\scriptscriptstyle{\rho a o}}$	Point addition operation in ECC	0.0062
$T_{\scriptscriptstyle cpo}$	Chebyshev polynomial operation	0.0328
$T_{mho}$	MapToPoint hash operation	0.2384

**Table 2:** Several cryptographic operation symbol definitions

<span id="page-15-1"></span>**Table 3:** Comparison of computational overhead evaluation of different scenarios in Case I

	Vehicle	TAI/TA/RA	CSS/CSP/UVA
ECPP[5]	$3T_{wm} + 8T_{uh} =$	$2T_{wsm} + 10T_{uh} =$	$3T_{wsm} + 7T_{uh} =$
	$1.2666$ (ms)	$0.85$ (ms)	$1.2654$ (ms)
SMAKA[44]	$3T_{msm} + 9T_{uh} + T_{sed} =$	$2T_{msm} + 10T_{uh} + T_{sed} =$	$3T_{msm} + 7T_{uh} =$
	$0.569$ (ms)	$0.3912$ ( <i>ms</i> )	$0.5454$ (ms)
UAV-assisted $[45]$	$7T_{mho} + 3T_{cpo} =$	$6T_{mho} + T_{cpo} =$	$10T_{mho} + 4T_{cpo} =$
	$1.7672$ (ms)	$1.4632$ (ms)	$2.5152$ (ms)
Our	$2T_{msm} + 5T_{uh} =$	$2T_{msm} + 2T_{uh} =$	$T_{msm} + 2T_{uh} =$
	$0.364$ (ms)	$0.3604$ (ms)	$0.1814$ ( <i>ms</i> )

<span id="page-15-2"></span>**Table 4:** Comparison of computational overhead evaluation of different scenarios in Case II



	$n$ Vehicle	TAI/TA/RA	m CSS/CSP/UVA
$ECPP$ [5]	$(m+2) nT_{wm} +$ $(5m + 3) nT_{th} =$ $0.425mn + 0.8416n$ (ms)	$(mn+n)T_{wsm}+$ $(3n + 7mn) T_{\mu h} =$ $0.4274mn + 0.4226n$ (ms)	$3mnT_{wsm} + 7mnT_{uh} =$ $1.2654mn$ (ms)
	<b>SMAKA</b> [44] $(m+2) nT_{msm}$ + $(5m+4) nT_{ub} + nT_{sed} =$ $0.185mn + 0.384n$ (ms)	$(m+n)T_{msm}+$ $(2m + 2n + 6mn) T_{uh} +$ $nT_{red} = 0.0072mn +$ $0.1814m + 0.2026n$ (ms)	$(2m + mn) T_{msm} +$ $(2m + 5mn) T_{uh} =$ $0.3604m +$ $0.185mn$ (ms)
UAV-assisted	$(7 + 4m) nT_{mbo} +$	$(6+7n) mT_{mbo} +$	$(3 + 7m) nT_{mbo} +$
$\left[45\right]$	$(4+m) nT_{\text{cm}} =$ $0.9864mn + 1.8n$ (ms)	$(1+n) m T_{\text{cpo}} =$ $1.4632m + 1.7016mn$ (ms)	$4mnT_{\text{cm}}=$ $0.7152n + 1.8mn$ (ms)
Our	$2nT_{mm} + (4+m) nT_{uh} =$ $0.0012mn + 0.3628n$ (ms)	$(n + m) T_{msm} + 2mn T_{uh} =$ $0.0024mn + 0.179m +$ $0.179n$ (ms)	$mnT_{msm} + 2mnT_{wh} =$ $0.1814mn$ (ms)

<span id="page-16-0"></span>**Table 5:** Comparison of computational overhead evaluation of different scenarios in Case III

(1) *Case I*: In this case, a single vehicle interacts solely with a CSS node system. [Table 3](#page-15-1) illustrates a comparison of the computational overhead between our scheme and three other schemes [\[5,](#page-26-2)[44,](#page-28-3)[45\]](#page-28-4) across the login, authentication, and key negotiation phases. These compared schemes also adopt a three-layer architecture similar to our scheme. During the login phase in our scheme, the vehicle needs to compute two one-way hash function operations. The authentication and key negotiation phases do not necessitate additional operations. Thus, the computational overhead for the vehicle is  $2T_{msm}$  + 5*Tuh* = 0.364 ms. When a vehicle user sends a message to the TAI, the TAI needs to perform two scalar multiplication and a one-way hash function operation, thus its computational overhead is  $2T_{msm}$  +  $2T_{uh} = 0.3604$  ms. Simultaneously, upon receiving the message from the TAI, the CSS undertakes one scalar multiplication and two one-way hash operations, with a computational overhead of  $T_{msm}$  +  $2T_{uh} = 0.1814$  ms. To illustrate the superiority of our scheme in computational overhead compared to other schemes, The results of the computational cost comparison for a vehicle to a CSS are shown in [Fig. 7a.](#page-16-1) It is evident from the figure that our scheme surpasses scheme [\[5\]](#page-26-2) and scheme [\[44\]](#page-28-3) significantly. Specifically, scheme [\[45\]](#page-28-4) exhibits notably higher computational costs compared to our scheme.



<span id="page-16-1"></span>**Figure 7:** Computational overhead (a Vehicle to a CSS; *n* Vehicle to a CSS, *n* from 2 to 10) [\[5](#page-26-2)[,44](#page-28-3)[,45\]](#page-28-4)

(2) *Case II*: In this case, a single CSS system is interacted with by *n* vehicles. [Table 4](#page-15-2) presents the computational costs incurred by these *n* vehicles, spanning from successful login to message transmission to the CSS, allowing for comparison with the literature [\[5,](#page-26-2)[44,](#page-28-3)[45\]](#page-28-4). Specifically, vehicles must execute 2*n* Montgomery curve multiplications and  $4n + 1$  one-way irreversible hash operations, resulting in a computational cost of  $2nT_{msm} + (4n + 1)T_{uh} = 0.3628n + 0.0012$  ms. Furthermore, the computational expenses for TAI and CSS amount to  $(n + 1)T_{msn} + 2nT_{uh} = 0.1814n + 0.179$  ms and  $nT_{msm} + 2nT_{uh} = 0.1814n$  ms, respectively. To demonstrate that our proposed scheme is more efficient in terms of computational costs compared to other schemes, [Fig. 7b](#page-16-1) presents a comparative analysis of the computational costs for *n* vehicles interacting with a single CSS. To facilitate the representation, the value of *n* ranges from 2 to 10. The results clearly indicate that our scheme significantly outperforms other approaches.

(3) *Case III*: In this case, *n* vehicles transmit authentication messages to *m* CSSs. [Table 5](#page-16-0) displays the computational overheads calculated by our scheme and the comparison schemes [\[5](#page-26-2)[,44](#page-28-3)[,45\]](#page-28-4) during the login, authentication message transmission to TAI and key negotiation phases, and post-receipt of messages from TAI by the CSSs. Given our emphasis on the computational overhead of resourceconstrained vehicles in practical settings, we solely present the computational overhead of vehicle entities. In our scheme, *n* vehicles logging in and sending messages to *m* CSSs requires computing 2*n* Montgomery curve proportional multiplications and  $(4 + m)n$  hashes, so the computational overhead is:  $2nT_{msm} + (4 + m) nT_{wh} = 0.0012mn + 0.3628n$  ms. When TAI receives the authentication and request messages sent from the vehicle and CSS, it needs to compute  $(n + m)$  times the Montgomery curve scaling multiplication, and 2*mn* hashes, so the computational overhead is  $(n + 1)T_{msm} + 2nT_{uh}$ 0.1814*n* + 0.179 ms. After CSS receives the request sent by TAI, it needs to compute *mn* times the Montgomery curve scaling multiplication and 2*mn* times the hash. The computational overhead of CSS is therefore  $mnT_{msm} + 2mnT_{uh} = 0.1814mn$  ms. To visually demonstrate the advantages of our scheme, [Fig. 8](#page-17-0) presents a comparison between our scheme and others. In this scenario, the number of vehicles ranges from 2 to 10, while the number of *m* CSSs is fixed at 10 for consistency. The figure illustrates that with multiple CSS, the computational load of this scheme is lower than that of scheme [\[5\]](#page-26-2) and scheme [\[44\]](#page-28-3) as *n* increases. Notably, the benefits of this scheme over scheme [\[45\]](#page-28-4) become more evident with a higher number of vehicles.



<span id="page-17-0"></span>**Figure 8:** Computational overhead (*n* Vehicle to *m* CSS, *n* from 2 to 10,  $m = 10$ ) [\[5](#page-26-2)[,44](#page-28-3)[,45\]](#page-28-4)

The analysis above demonstrates that, our proposed scheme has a lower total computational overhead than the schemes [\[5](#page-26-2)[,44,](#page-28-3)[45\]](#page-28-4), exhibiting a significant advantage. This reduction in computational overhead enhances the efficiency of the trust evaluation mechanism, making it more suitable for realtime applications in vehicular networks where vehicles have limited computational resources.

## *6.2 Comparison of Communication Overhead*

Initially, we establish an identical security condition, where  $P_1 = 20 B$ ,  $p = 64 B$ , the size of  $G_1$  is  $20 \times 2 = 40$  B, and G<sub>2</sub> is 64  $\times$  2 = 128 B. Additionally, the hash output is 20 B in size, the encryption and decryption output is 16 B, and the size for both the timestamp and request information is 4 B. Elliptic curve proportional multiplication belong to  $G_1$ , yields an output of 40 B. [Tables 6–](#page-18-0)[8](#page-19-0) display the communication overhead during the authentication and key negotiation stages for the aforementioned cases, respectively. As the AKA stage of the schemes [\[5](#page-26-2)[,44](#page-28-3)[,45\]](#page-28-4) is similar to our scheme, this paper introduces the proposed scheme.

**Table 6:** Evaluation of communication overhead for different scenarios in Case I

<span id="page-18-0"></span>

Scheme	Number of rounds for sending messages	Interaction flow between entities	Communication cost
$ECPP$ [5]	6	$V_i \rightarrow TA \rightarrow CSP \rightarrow$ $TA \rightarrow CSP \rightarrow V_i \rightarrow CSP$	$88 + 4 + 88 + 124 +$ $104 + 20 = 428$ (B)
SMAKA[44]	4	$CSP \rightarrow V_i \rightarrow RA \rightarrow$ $CSP \rightarrow V_i$	$84 + 76 + 104 + 68 =$ 368(B)
UAV-assisted $[45]$ 4		$V_i \rightarrow TA \rightarrow U_i \rightarrow TA \rightarrow$ V.	$100 + 84 + 104 + 104 =$ 392(B)
Our		$V_i \rightarrow TAI \rightarrow CSS \rightarrow$ $TAI \rightarrow V_i$	$48 + 16 + 24 + 44 =$ 132(B)

**Table 7:** Evaluation of communication overhead for different scenarios in Case II

<span id="page-18-1"></span>

(1) *Case I*: [Table 6](#page-18-0) lists the rounds required for a vehicle to send information to the CSS node and the interaction among various entities, and calculates the communication overhead for each process. During the vehicle login, authentication, and key negotiation stages, the proposed scheme requires four rounds of information transmission. These four pieces of information are  $D1 = \{M_i, CT_i, G_i\}$  $D2 = \{M_i, VID_i, CT_i, v\}, D3 = \{M_i, CT_i, r_i\}$ , and  $D4 = \{M_i, CT_i\}$ . And the communication overheads of them are  $|D1| = (4 + 4 + 40) = 4$  B,  $|D2| = (4 + 4 + 4 + 4) = 16$  B,  $|D3| = (20 + 4 + 20) = 44$  B,  $|D4| = (20 + 4) = 24$  B, respectively. [Fig. 9](#page-19-1) illustrates a comparative analysis between our scheme and alternative schemes for a single vehicle to a CSS system, aiming to present the scheme's advantages more clearly. It is evident from the figure that our scheme exhibits reduced communication overhead compared to schemes [\[5](#page-26-2)[,44](#page-28-3)[,45\]](#page-28-4).

<span id="page-19-0"></span>

Scheme	Number of rounds for sending messages	Interaction flow between entities	Communication cost
$ECPP$ [5]	$5mn + n$	$V_i \rightarrow TA \rightarrow CSP \rightarrow$ $TA \rightarrow CSP \rightarrow V_i \rightarrow CSP$	$88n + 4mn + 88mn +$ $124$ mn + 104 mn + $20$ mn $=$ $88n + 340mn$ (B)
<b>SMAKA</b> [44]	$2mn + m + n$	$CSP \rightarrow V_i \rightarrow RA \rightarrow$ $CSP \rightarrow V_i$	$84m + 76n + 104mn +$ $68mn =$ $172mn + 84m + 76n$ (B)
UAV-assisted [45] $3mn + n$		$V_i \rightarrow TA \rightarrow U_i \rightarrow TA \rightarrow$ $V_{i}$	$100n + 84mn + 104mn +$ $104mn =$ $292mn + 100n$ (B)
Our	$3mn + n$	$V_i \rightarrow TAI \rightarrow CSS \rightarrow$ $TAI \rightarrow V_i$	$48n + 16mn + 44mn +$ $24mn = 84mn + 48n(B)$

**Table 8:** Evaluation of communication overhead for different scenarios in Case III



<span id="page-19-1"></span>**Figure 9:** Evaluation of communication overhead for different scenarios (a Vehicle to a CSS) [\[5,](#page-26-2)[44,](#page-28-3)[45\]](#page-28-4)

(2) *Case II*: As illustrated in [Table 7,](#page-18-1) the proposed scheme necessitates 4*n* rounds for *n* vehicles corresponding to a CSS system in the login authentication and key negotiation phases. The communication overhead of the data transmitted in each round is detailed below:  $n|D1| = n(4 + 4 + 40) = 48n$ B, *n* |*D*2| = *n (*4 + 4 + 4 + 4*)* = 16*n* B, *n* |*D*3| = *n (*20 + 4 + 20*)* = 44*n* B, *n* |*D*4| = *(*20 + 4*)* = 24*n* B. So total communication overhead is: $n |D1| + n |D2| + n |D3| + n |D4| = 48n + 16n + 44n +$  $24n = 132n$  B. The table demonstrates that the communication overhead in this paper is significantly lower than in other schemes [\[5,](#page-26-2)[44,](#page-28-3)[45\]](#page-28-4). To further illustrate the advantages of our scheme, [Fig. 10a](#page-20-0) provides a comparative analysis of the communication overhead for *n* vehicles interacting with a single CSS, where *n* ranges from 2 to 10. The results clearly show that our scheme significantly reduces communication overhead compared to other schemes.



<span id="page-20-0"></span>**Figure 10:** Communication overhead (*n* Vehicle to a CSS, *n* from 2 to 10; *n* Vehicle to *m* CSS, *n* from 2 to 10,  $m = 10$ ) [\[5,](#page-26-2)[44,](#page-28-3)[45\]](#page-28-4)

(3) *Case III*: As shown in [Table 8,](#page-19-0) the proposed scheme requires *(*3*mn* + *n)* rounds for multiple vehicles corresponding to multiple CSSs during the login, authentication, and key negotiation phases. Since the vehicle sends the vehicle information and the TAI selects the appropriate CSS for service, only *n*vehicles corresponding to *m* CSSs are required each time. However, the schemes [\[5,](#page-26-2)[44,](#page-28-3)[45\]](#page-28-4) incurs significant communication cost, which require  $5mn + n$ ,  $2mn + m + n$ , and  $3mn + n$  interactions, respectively. In this paper, the total communication overhead in this case is  $n|D1| + mn|D2| + mn$  $|D3| + n|D4| = 48n + 16mn + 44mn + 24mn = 84mn + 48n$  B. To demonstrate our advantage in comparison with other schemes regarding communication overhead, [Fig. 10b](#page-20-0) illustrates the comparison of communication overhead in relation to a CSS from a varying number of vehicles to *m* CSSs. Since we emphasize the communication overhead of resource-constrained vehicles in practical applications, only the communication overhead of different numbers of vehicles is presented. For clarity, where *m* is set to 10 and *n* ranges from 2 to 10. From the figure, it is evident that as the number of vehicles increases with multiple *m*, this scheme exhibits lower communication costs compared to other schemes.

The above analysis, evidently show that the communication cost of our proposed scheme is lower than that of the related schemes [\[5,](#page-26-2)[44,](#page-28-3)[45\]](#page-28-4). This reduction in communication overhead enables the trust evaluation mechanism to handle more nodes and interactions with reduced delay, improving scalability.

#### *6.3 Comparison of Storage Overhead*

In system evaluation, storage overhead plays a crucial role. Given that the size of  $G_1$  is 40 B and  $G_2$ is 128 B, we assume that the real identity and password of each entity are 40 B, while the key, session key, master key, and private key are 128 B. Additionally, the group size is 128 B, with the generator of the group also 128 B, and the order of the generator 4 B. The public key encryption output is 40 B. Other parameter sizes are in the communication overhead section and will not be repeated here. [Tables 9–](#page-21-0)[11](#page-21-1) provide a comparative analysis of the storage overhead of our proposed scheme and other schemes in various scenarios. Since the existing schemes [\[5,](#page-26-2)[44,](#page-28-3)[45\]](#page-28-4) are structurally similar to ours, the following subsections will focus on the comparative advantages of our proposed scheme.

<span id="page-21-0"></span>

	Vehicle	TAI/TA/RA	<b>CSS/CSP/UVA</b>
$ECPP$ [5]	$40 + 40 + 20 + 20 + 128 =$ 248(B)	$128+40+20+20+20=$ 228(B)	$20 + 20 + 40 + 128 =$ 208(B)
SMAKA[44]	$40 + 40 + 20 + 20 + 128 +$ $128 + 20 + 20 + 4 = 420$ (B)	$20+20+4+20+20+4+$ $20+128+20+128+4+$ $128 + 20 + 20 = 556$ (B)	$20 + 128 + 4 + 128 +$ $20+20+4+20+20=$ 364(B)
UAV-assisted $[45]$	$20 + 20 + 4 + 40 + 40 + 20 =$ 144(B)	$40 + 4 + 40 + 4 + 40 +$ $128 = 256$ (B)	$20+20+4+20+20=$ 84(B)
Our	$40 + 40 + 20 + 40 + 40 +$ $20 + 20 = 220$ (B)	$40 + 128 + 20 + 20 + 4 =$ 212(B)	$20 + 40 + 4 = 64$ (B)

**Table 9:** Comparison of storage overhead evaluation of different scenarios in Case I

**Table 10:** Comparison of storage overhead evaluation of different scenarios in Case II

<span id="page-21-2"></span>

	$n$ Vehicle	<b>TAI/TA/RA</b>	<b>CSS/CSP/UVA</b>
ECPP[5]	$40n + 40n + 20n + 20n$	$128n + 40n + 20n +$	$20n + 20n + 40n +$
	$+ 128n = 248n(B)$	$20n + 20n = 228n(B)$	$128n = 208n$ (B)
SMAKA[44]	$40n + 40n + 20n + 20n$ $+ 128n + 128n + 20n + 20n$ $+4n = 420n$	$20n + 20n + 4n + 20n$ $+20n + 4n + 20n +$ $128n + 20n + 128n$ $+4n+128n+20n+20n$ $= 556n$ (B)	$20n + 128n + 4n +$ $128n + 20n + 20n +$ $4n + 20n + 20n$ $= 364n$
UAV-assisted $[45]$	$20n + 20n + 4n + 40n +$	$40n + 4n + 40n + 4n +$	$20n + 20n + 4n +$
	$40n + 20n = 144n$ (B)	$40n + 128n = 256n$ (B)	$20n + 20n = 84n$ (B)
Our	$40n + 40n + 20n + 20n +$	$40n + 128n + 20n +$	$20n + 40n + 4n =$
	$20n + 40n + 40n = 220n$ (B)	$20n + 4n = 212n$ (B)	64n(B)

<span id="page-21-1"></span>**Table 11:** Comparison of storage overhead evaluation of different scenarios in Case III



(Continued)



(1) *Case I*: In this case, a single vehicle interacts with a single CSS node. As shown in [Table 9,](#page-21-0) we compare the storage overhead of our scheme with other schemes during the registration, login, authentication, and key agreement phases. When a vehicle registers with the TAI, it needs to store two parameters encrypted with the TAI's public key. The parameters required for the login phase are already stored during registration, eliminating the need for additional storage at that stage. For key agreement between vehicles, each vehicle stores the unique identifier and the hashed value of the password for both itself and the interacting vehicle. Additionally, vehicles interacting with the TAI need to store two hash functions,  $H_1$  and  $H_2$ , generated by the TAI during initialization for encryption computations. As a result, the total storage overhead for a single vehicle is  $40+40+20+20+20+40+$  $40 = 220$  B. For the TAI, the required storage includes its public-private key pair, two hash functions, and trust scores for vehicles during key negotiation, amounting to  $40 + 128 + 20 + 20 + 4 = 212$ B. The CSS stores a hash function and the elliptic curve scalar multiplication for registration, as well as the request information sent by the vehicle during authentication and key agreement, resulting in a total storage overhead of  $20 + 40 + 4 = 64$  B. Since the CSS continuously monitors traffic conditions in real time and is typically delegated to cameras, only the storage overhead of interaction information for trust evaluation is considered. To clearly demonstrate the advantages of our scheme, [Fig. 11a](#page-22-0) provides a comparative analysis of the storage overhead for a single vehicle interacting with a single CSS. As shown in [Table 9](#page-21-0) and [Fig. 11a,](#page-22-0) the storage overhead of our scheme demonstrates reasonable performance in resource-constrained scenarios. Compared to existing schemes [\[5,](#page-26-2)[44,](#page-28-3)[45\]](#page-28-4), our proposed solution is suited for complex vehicular network environments.



<span id="page-22-0"></span>**Figure 11:** Storage overhead (a Vehicle to a CSS; *n* Vehicle to a CSS, *n* from 2 to 10) [\[5,](#page-26-2)[44](#page-28-3)[,45\]](#page-28-4)

(2) *Case II*: In this case, *n* vehicles interact with a single CSS system. [Table 4](#page-15-2) outlines the storage overhead incurred from the registration phase to the transmission of information to the CSS. Specifically, each of the *n* vehicles store two parameters encrypted with the TAI's public key, along with the hash values generated during key agreement between vehicles. Each vehicle also needs to store its unique identifier, password, and the two hash functions generated by the TAI for secure data transmission, resulting in a total storage overhead of  $40n+40n+20n+20n+20n+40n+40n = 220n$ B. The TAI must store the public-private key pairs for *n* instances, two hash functions, and trust score request information for *n* instances, leading to a storage overhead of  $40n + 128n + 20n + 20n$  $+ 4n = 212n$  B. The CSS is required to store *n* instances of hash values, elliptic curve scalar multiplications, and the request information sent by the vehicles, amounting to a storage overhead of  $20n + 40n + 4n = 64n$  B. To clearly illustrate the storage overhead of our scheme, [Fig. 11b](#page-22-0) provides a comparative analysis focused on the communication overhead for resource-constrained vehicles in practical applications. For clarity, the number of vehicles is set between 2 and 10. As observed from [Table 10](#page-21-2) and [Fig. 11b,](#page-22-0) the storage overhead of our scheme remains within manageable limits, demonstrating its practicality in resource-constrained vehicular networks.

(3) *Case III*: In this case, *n* vehicles transmit authentication messages to *m* CSSs. We compare the storage overhead of our proposed scheme with other schemes [\[5,](#page-26-2)[44,](#page-28-3)[45\]](#page-28-4), focusing on different stages such as registration, login, key agreement, and inter-entity interaction, as shown in [Table 11.](#page-21-1) Given the focus on resource-constrained vehicles in practical environments, we specifically discuss the computational and storage overhead for the vehicle entities. In our scheme, each vehicle is required to store *mn* instances of two public key encryption parameters and the hash values generated between vehicles. Additionally, vehicles must store their unique identifiers, passwords, and two hash functions generated by the TAI for secure data transmission. Furthermore, each vehicle needs to store *n* instances of its unique identifier and password. Therefore, the total storage overhead for each vehicle is  $40mn + 40mn + 20mn + 20mn + 40n + 40n = 140mn + 80n$  B. For the TAI, the storage overhead consists of *mn* instances of public-private key pairs, two hash functions, and vehicle request information. Hence, the TAI's total storage overhead is 40*mn*+128*mn*+20*mn*+20*mn* + 4*mn* = 212*mn* B. Finally, for the CSS, the storage overhead involves *mn* instances of one-way hash values, elliptic curve scalar multiplications, and vehicle request information, resulting in the following storage requirement:  $20mn + 40mn + 4mn = 64mn$  B. To visually illustrate the storage overhead, [Fig. 12](#page-24-1) compares our scheme with other schemes as the number of vehicles *n* increases from 2 to 10, with the number of CSS *m* fixed at 10 for consistency. The results show that as *n* increases, our scheme consistently demonstrates lower storage overhead compared to scheme [\[5\]](#page-26-2) and scheme [\[44\]](#page-28-3). Compared to scheme [\[45\]](#page-28-4), our scheme remains a suitable and effective choice for vehicular networks, particularly as the number of vehicles grows.

The above analysis demonstrates that our proposed scheme offers a significant advantage in terms of total storage overhead. Although the storage overhead on the vehicle side is higher compared to scheme [\[45\]](#page-28-4), our scheme provides clear benefits over scheme [\[5\]](#page-26-2) and scheme [\[44\]](#page-28-3). Additionally, in terms of storage overhead at the TAI and CSS sides, our scheme performs more efficiently than schemes [\[5,](#page-26-2)[44,](#page-28-3)[45\]](#page-28-4). By employing a trust evaluation mechanism, our scheme optimizes storage distribution by focusing on real-time monitoring and dynamic trust updates, reducing the need for excessive data retention. This enhances both the performance and adaptability of the scheme in vehicular networks, particularly in environments where efficient storage use is critical for ensuring security and maintaining trust during real-time communication.



<span id="page-24-1"></span>**Figure 12:** Storage overhead (*n* Vehicle to *m* CSS, *n* from 2 to 10,  $m = 10$ ) [\[5](#page-26-2)[,44](#page-28-3)[,45\]](#page-28-4)

## <span id="page-24-0"></span>**7 Discussion**

The proposed scheme employs a trust evaluation mechanism, where CSS plays a crucial role in real-time monitoring of road conditions and vehicle interactions. This real-time supervision is vital, as failure to detect malicious behavior can lead to serious security issues. In our scheme, we assume that the CSS is fully trusted. If malicious vehicles attempt to send deceptive information during vehicleto-vehicle interactions, the reporting vehicle can file a complaint to the CSS via the TAI. Given that the CSS continuously monitors road conditions, both the behavior of the reporting and the reported vehicles will be accurately assessed, minimizing the risks of false positives or negatives. The CSS then applies trust evaluation to reward or penalize the involved vehicles accordingly. This mechanism is essential, as real-time monitoring and punishing malicious vehicles in practical vehicular networks would otherwise entail significant computational, communication, and storage overhead. By utilizing this trust-based approach, our scheme effectively mitigates these challenges, thus fostering a more secure vehicular network environment.

However, in practical scenarios, the assumption of a fully trusted CSS may be limiting, as achieving complete trustworthiness in real-world deployments is challenging. Additionally, vehicular networks are inherently dynamic systems. In our scheme, different regions are managed by distinct RSUs, and interactions between vehicles in different regions are facilitated through cluster head vehicles. Vehicles entering a new region do not have access to the previous interaction data of that region, while vehicles exiting the region no longer have access to subsequent interactions occurring within it. Failure to maintain this boundary could introduce security vulnerabilities. This dynamic nature poses a challenge to the scalability of the scheme, as vehicles frequently enter and exit different regions.

To address these challenges, integrating federated learning with blockchain technology offers a promising solution. Federated learning allows vehicles to collaboratively learn trust models without sharing sensitive data, preserving privacy while improving the accuracy of trust evaluations. Meanwhile, blockchain ensures the integrity and immutability of trust records across different regions, allowing vehicles entering new areas to verify past interactions without accessing the full historical data. This combination enhances the scalability of the scheme by securely managing dynamic vehicle interactions and mitigating trust issues without overloading the network with communication and

computational overhead. By leveraging these technologies, our scheme could more effectively handle the inherent dynamism of vehicular networks while maintaining security and efficiency.

## <span id="page-25-2"></span>**8 Conclusion**

This paper proposed a distributed network architecture based on trust scores. It aimed to improve the vehicular network environment by enabling numerous vehicles to report malicious ones disseminating erroneous information to the TAIs. Specifically, vehicles sent reporting information to the TAIs, which then relayed this information to the CSSs for detection. Based on the CSSs' s detection results, the TAI increased or decreased the trust scores of the reporting and the reported vehicles, thus enhancing the security across the vehicular network. Regarding security, we demonstrated the proposed scheme achieved the security objectives. Compared to other schemes, our scheme had lower computation and communication overhead and exhibited superior scalability. In the future, we will further improve this scheme by using a federated learning-based trust score evaluation mechanism to accommodate more complex scenarios.

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