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1 Article

2 Design and Implementation of a Trust Information 3 Management Platform for Social Internet of Things 4 Environments

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15 **Abstract:** As the vast amount of data in social Internet of Things (IoT) environments considering
16 interactions between IoT and people is accumulated and processed through cloud and big data
17 technologies, the services that utilize them are used in various application fields. The trust between
18 the IoT devices and their data is recognized as the core of IoT ecosystem creation and growth.
19 Connection with suspicious IoT devices may pose a risk to services and system operation. Therefore,
20 it is very essential to analyze and manage trust information for devices, services, and people as well
21 as to provide the trust information to the other devices or users that need them. This paper presents
22 a trust information management framework which contains a generic IoT reference model with trust
23 capabilities to achieve the goal of converged trust information management. Then, a Trust
24 Information Management Platform (TIMP) consisting of trust agents, trust information brokers and
25 trust information management systems is proposed, which aims to provide trustworthy and safe
26 interactions among people, virtual objects, and physical things. Implementing and deploying TIMP
27 enable to build a trustworthy ecosystem while activating social IoT businesses by reducing the
28 transaction costs as well as by eliminating the uncertainties in the use of social IoT services and data
29 transactions.

30 **Keywords:** Trust, trust information management platform, trust index, internet of things, cyber
31 physical system

32

33 1. Introduction

34 At the beginning stage of Internet of Things (IoT) technologies, physical sensors and devices
35 were considered as main targets to be managed and controlled by IoT service operators for the
36 purpose of providing sensing services to users. However, as IoT is evolving as a common service
37 infrastructure, various applications and services of IoT have been emerging into markets in broad
38 areas, e.g., smart home/building, health care, security, transportation, and so on. Recently, IoT is
39 stimulated by the advent of Cyber Physical Systems (CPS) [1], where physical things are connected
40 to each other and connected to cyber objects to provide intelligent services [2]. In CPS, the physical
41 domain and the cyber domain are substantially the same, in which both functional capabilities are
42 connected and affect each other.

43 In more recent years, studies on interactions between IoT and people such as Cyber Physical
44 Social Systems (CPSS) [3] and Social IoT (SIoT) [4],[5] are actively being carried out. The paradigm of
45 CPSS and SIoT has been expanded to encompass not only the physical and the cyber domain but also

46 the social domain. The physical IoT domain perceives the dynamic physical environment, collects
47 and delivers data by using physical things, while the cyber IoT domain computes and analyzes the
48 data through one or more cyber objects, and useful information or knowledge for context awareness
49 and decision making can be used by users in the social IoT domain through interactions among
50 individuals and communities as well as physical things.

51 However, the introduction of newly developed technologies is always subject to uncertainty,
52 which is likely to cause problems in terms of stability and security [6]. In particular, there is no
53 guarantee of a certain level of control and reliability. If there is no trust between humans, the
54 exchange of data and information between them is also meaningless because there is no confidence
55 in each other [7]. Human-to-machine interactions have also proven to be unpredictable and
56 unreliable, regardless of the normal functioning of the human and machine systems [8].

57 The direct connection between IoT devices occurs in variable manners, increasing the complexity
58 of IoT services and applications, and there is a high likelihood of potentially unknown risks due to
59 this complex interaction. In addition, as the IoT application services spread to the real world and the
60 interactions between IoT devices and users become frequent, increased suspicion about whether IoT
61 devices and services operate without any problems for their original purposes and whether they are
62 harmful to users is recognized as a major obstacle [9].

63 A matter of trust on collecting data is also a critical issue in the physical IoT domain. Because of
64 the hacked or damaged devices, IoT service quality will be significantly degraded even though trust
65 in the cyber IoT domain can be fully supported. Next, data processing trust should be guaranteed in
66 the cyber IoT domain. Therefore, trust in IoT needs to be managed through the physical and the cyber
67 IoT domains in a holistic manner.

68 The expanded paradigm of IoT including CPSS and SIoT makes it difficult for users to grasp
69 whether or not the neighboring things and services are reliable and credible. That is, collecting data
70 from trustworthy physical things is the first step to provide trustworthy information and
71 communication technology (ICT) services and applications and proper virtual objects have to be
72 chosen to get a trustworthy knowledge or meaningful information by analyzing and calculating the
73 data. However, current IoT infrastructures cannot fundamentally block both economic and financial
74 losses from various malicious attacks, thus increasing user mistrust. In other words, the present
75 security technology is a perimeter-based security solution, and it can cope with a malicious attack on
76 a contact point, so there is a limit to the fundamental solution.

77 In this background, there are technical demands for verifying and confirming the trust of the
78 SIoT based on the interactions between IoT devices, services, and people in the physical, the cyber,
79 and the social IoT domains. Trust of IoT devices and data is a prerequisite for the spread and
80 activation of SIoT-based industries and services such as smart home, connected cars and
81 telemedicine. By analyzing and managing trust information for devices, services, and people as well
82 as by providing the trust information to the other devices or users that need them, IoT devices and
83 services will be more trustworthy and reliably used. However, the existing papers on trust have
84 mainly focused on the theoretical aspects of users' trust analysis algorithms[10]. Thus, this paper aims
85 to present a practical system design and implementation based on the service model to analyse and
86 provide trust information for service realization in align with the international standard – ITU-T
87 Y.3052 (see Clause 2.1) [11].

88 In this paper, we design a trust information management framework which contains a generic
89 IoT reference model with trust capabilities to achieve the goal of converged trust information
90 management. Then, we propose a Trust Information Management Platform (TIMP) consisting of trust
91 agents, trust information brokers and trust information management systems in SIoT environments.
92 The design and implementation of TIMP enables trust-based reliable and stable services by verifying
93 and providing trust information for data, devices, services and users in emerging SIoT environments
94 where people, objects and services interact frequently.

95 As a typical example of TIMP-based services, this paper considers various sharing services (e.g.,
96 Airbnb and Uber) that temporarily connect offices, accommodations, automobiles, owned by a
97 particular person, to other people. These services have recently emerged and showed a high

98 utilization rate. Unlike that individuals use well-known hotels and car rental companies, because
99 strangers have short-term lease of each other's house and automobile in the sharing economy world,
100 a tenant must confront uncertainty and risk in using such a lease service. Therefore, it becomes a big
101 obstacle in using and spreading such a service. From the point of view of owners of resources, since
102 a lender lends its resource to a complete stranger, the lender has a concern about whether the
103 complete stranger will use the resource cleanly and carefully according to the contracted terms. From
104 the illustration of a use case, the paper demonstrates a key operation and procedure of essential
105 components to analyze and use trust information in emerging IoT services and applications to cope
106 with sharing economy.

107 The remainder of this paper is organized as follows. Background information on trust is
108 provided in Section 2. A trust information management framework is described in Section 3. Section
109 4 proposes detailed components of TIMP and presents a trust data analytics procedure including the
110 trust data processing and analytics to derive trust indexes of physical things, virtual objects, users
111 and services. In Section 5, we show the implementation of the proposed solutions and demonstrates
112 a use case for TIMP-based resource sharing services . Finally, we summarize our work in Section 6.

113 **2. Background**

114 *2.1. Definition and attribute of trust*

115 In a lexical sense, trust is a concept that implies the integrity, power, ability, and assurance of a
116 person or thing. Generally, trust is used as a measure of confidence that it will behave as expected,
117 even though it lacks the ability to observe or control the environment in which it operates [6]. The
118 concept of trust itself is very complex with different meanings depending on who/what the subject,
119 situation, etc. and is influenced by various measurable factors and unmeasurable factors. There are
120 also a number of trust attributes, but they frequently vary over a specific time period within a
121 particular context. Thus, it's very difficult to make them be generalized, regardless of personal
122 preferences and situation.

123 According to the previous research, trust is described by objective factors such as competence
124 and reputation, along with some subjective factors such as the status in social relations and physical
125 attributes. Here, competence is a measure of the ability of a person to perform a given task based on
126 his/her degree, qualifications and experience, and reputation is formed based on the opinions of
127 people who have previously interacted with the subject [4].

128 The term trust is a terminology originated from humanities and social sciences. Trust is thus a
129 broad concept used in many fields and subject areas, but until now there has been no generally agreed
130 definition. In the ICT domain, confusion arises in the use of terminology because it is mixed with
131 various interpretations and definitions such as information security, privacy and reliability.

132 To build converged ICT services and a reliable information infrastructure, ITU-T (International
133 Telecommunication Union Telecommunication Standardization Sector) Study Group 13 on future
134 networks and cloud has been working on future trusted ICT infrastructures and recently published
135 the Recommendation Y.3052 "Overview of trust provisioning in ICT infrastructures and services"[11]
136 regarding the concept of trust, a trust relationship model and trust evaluation with trust indicators
137 and trust index. According to the Y.3052, trust is defined as "the measurable belief and/or confidence
138 which represents accumulated value from history and the expecting value for the future". Trust
139 indicators represent fundamental criteria for evaluating trust of entities in ICT environments. Trust
140 indicators can be categorized into two major parts: objective trust indicators and subjective trust
141 indicators. Trust index is a comprehensive accumulation of trust indicators, which can evaluate and
142 quantify trust of entities.

143 *2.2. Previous researches on trust in SIoT*

144 At the beginning stage of IoT technologies, sensors and devices were considered as passive
145 objects to be managed and controlled. As people interact more and more closely with the
146 circumambient physical things, IoT industries and academia have been paying much attention to

147 SIoT which is defined as an IoT where things are capable of establishing social relationships with
 148 other objects, autonomously with respect to people [4]. In the SIoT, a physical thing is capable of
 149 discovering and selecting other things in imitation of social relationships with people [5].

150 From the cognitive and subjective aspect of human's mind, the trust of things is recognized as a
 151 key challenge for invigorating IoT services. [5] proposes the subjective model and the objective model
 152 for trust management of SIoT. The former is used to compute the trust of things on the basis of its
 153 own experience and the reputation on the thing. In the latter, the trust of things is determined by
 154 using distributed and stored information based on peer-to-peer structure [12]. Ontology-based
 155 semantic models have also used to analyze the trust of things. However, existing trust models have
 156 mainly focused on limited IoT capabilities for the physical domain and reasoning for the trust of IoT
 157 devices.

158 On the other hand, social networks and social media are growing rapidly and users can share
 159 their thoughts (e.g., Twitter), multimedia (e.g., YouTube), personal activities, information (e.g.,
 160 Facebook) and documents or calendars (e.g., Google+) through a variety of services [13],[14]. The
 161 social network based on the technology of Web 2.0 has greatly enhanced the participation of users on
 162 the web by providing an environment where users can easily communicate with each other and easily
 163 share interesting contents such as photographs and video clips [15]. Such social networks typically
 164 represent various attributes of user profiles and user relationships, that is, between a person and a
 165 person, and between a person and content. Many people spend more time on social networking sites
 166 than ever before and prefer to communicate and interact with friends through social media [16]. A
 167 social network is a social structure made up of a set of people and a set of links between people. The
 168 social network perspective provides a set of methods for analyzing the structure of whole social
 169 entities as well as a variety of theories explaining the patterns observed in these structures [17]. There
 170 are some advantages by applying the social networking technologies to the IoT [4]: 1) Trust can be
 171 defined and examined for leveraging the degree of interactions among things, 2) Discovery of objects
 172 and services can be executed scalably and effectively like in the human social networks, and 3) Social
 173 network modeling and analysis can be re-used to address IoT related issues.

174 In the SIoT, trust of things is recognized as a key challenge to grasp whether or not the
 175 neighboring things and services are reliable and credible. For example, in crowd sourcing
 176 applications such as swarm intelligence, each object will be used as the bearer of its specific service
 177 to the community [4]. To realize this scenario, objects need to make social relationships including the
 178 policy, activities, object profile, etc. According to [5], relationships between objects in SIoT can be
 179 classified as follows [18]:

- 180 • 'co-location' relationship to be established among objects used always in the same place;
- 181 • 'co-work relationship to be established whenever objects collaborate to provide a common IoT
 182 application;
- 183 • 'parental' relationship to be related to objects belonging to the same production batch (e.g., same
 184 manufacturer, same model);
- 185 • 'co-ownership' relationship to be established among heterogeneous objects which belong to the
 186 same user.

187 The main advantage by using these social relationships between objects is that objects can offer
 188 services to their owners by autonomously cooperating with other objects, irrespective of whether or
 189 not there are social connections between the owners of such objects.

190 Especially, this SIoT concept may play an important role in the deployment of services that
 191 depend on loosely coupled interactions among objects and whose value is in their capability of
 192 dynamically discovering key information and services from unknown communities of objects. To
 193 realize this service based on SIoT, each object should be equipped with social functionalities to
 194 discover other social objects and to search for information and services by collecting the object social
 195 network.

196 It is evident that the openness of social behavior introduces many weaknesses from the security
 197 point of view that have to be addressed appropriately before deploying relevant applications.
 198 However, the evaluation of an object's trust can take advantage of the social network itself and be

199 performed with appropriate models for managing the trust of the other social objects which may
200 behave maliciously.

201 Our previous work [19] presented a trust evaluation model called REK, comprised of the triad
202 of trust indicators: Reputation (public evidence on a trustee), Experience (personal expertise about
203 the situation and the context) and Knowledge (understandings on a trustee). The REK model covers
204 multi-dimensional aspects of trust by incorporating heterogeneous information from personal
205 experiences to global opinions [20]. By extending the REK model, [21] proposed a quantifiable trust
206 assessment model based on machine learning and [22] proposed a novel trust model called
207 experience–reputation (E-R) for evaluating trust relationships between any two mobile device users.

208 Based on our previous theoretical trust model, this paper presents a framework for designing all
209 required components to comprehensively cover the overall operations and procedure for trust
210 information collecting, processing and management including analytics. It also focuses on
211 implementation and demonstration of a service platform with trust solutions (i.e., TIMP) required for
212 various services and applications in SIoT environments.

213 **3. Trust Information Management Framework**

214 In this section, we present a trust information management framework which contains a
215 reference model and related capabilities with three IoT domains in order to achieve the design goal
216 of converged trust information management.

217 *3.1. Converged trust information management*

218 Trust information services can be used to verify trust in people, objects, and applications in
219 various SIoT services. Many SIoT service providers need the trust information service for the purpose
220 of maintaining quality and providing reliable and stable transactions for their services. In addition,
221 individual users also require the trust information service for the purpose of prevention of leakage
222 of personal data, prevention of fraudulent telephone calls, prevention of housing invasion, and
223 security check of user devices including IoT [23].

224 In order to provide the trust information services, it is necessary to collect trust-related data first
225 for users, devices, applications including social, cyber, and physical areas of public, corporate,
226 individual sectors according to the demand of SIoT service providers and users. After that, it is
227 required to measure and analyze the trust of users, devices and applications through modeling and
228 reasoning for suitable trust analysis according to the demand of the SIoT services. In addition, a
229 convenient trust service interface based on a Web Application Programming Interface (API) must be
230 provided so that various services and users can easily access the trust information service.

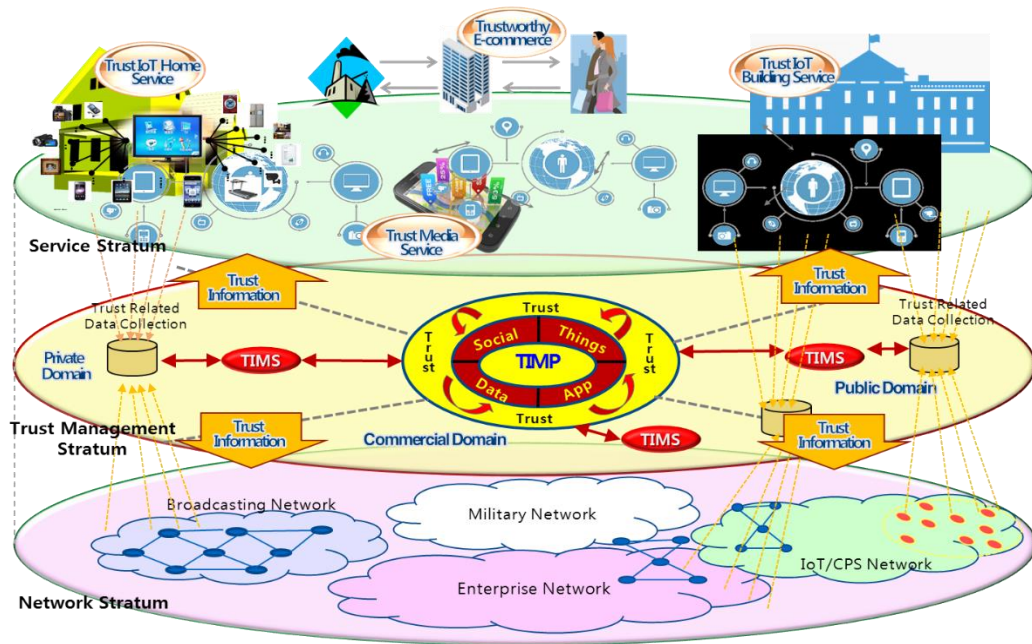


Figure 1. Converged trust information management.

Such a solution should not be limited to a specific service or application, but should be widely used for verifying reliability of users and devices in various IoT services and applications. To this end, the trust information management solution should minimize the dependency on services and applications, and the functions such as trust information analysis and management should be as common as possible so that they can be reused in various services.

Figure 1 shows a conceptual diagram of the converged trust information management, which consists of network stratum containing of physical devices connected to each other through a network, service stratum transferring, storing and processing data and information in various services, and trust management stratum that is responsible for analyzing and providing trust information services to SIoT service providers and users. There is a Trust Information Management Platform (TIMP) that commonly analyzes and manages trust information on the Cloud. The home and building services can analyze and manage trust information within their service domains using the Trust Information Management System (TIMS) which is dynamically allocated from the TIMP according to the Software-as-a-Service (SaaS) method.

A trust domain is a collection of trustworthy objects and data including users, networks, data storages and applications. To provide end-to-end trustworthy services, multiple trust domains need to be associated and the trust information maintained and managed for objects, users, and services in each trust domain should be shared with each other.

3.2. Generic IoT trust reference model

Trust information management has been highlighted as a key issue in the mediation and handling of commercial services, as well as the decision making in business processes. Trust information management plays an important role in the IoT to detect, monitor and collect data from various kinds of devices such as sensor nodes, sensor gateways, user equipment, home gateways and network gateways in the physical IoT domain as well as cyber objects and services/applications in the cyber IoT domain as shown in Figure 2. Moreover, in the social IoT domain, trust information serves as a basis for decision-making, even as people select IoT services or connect to nearby IoT devices.

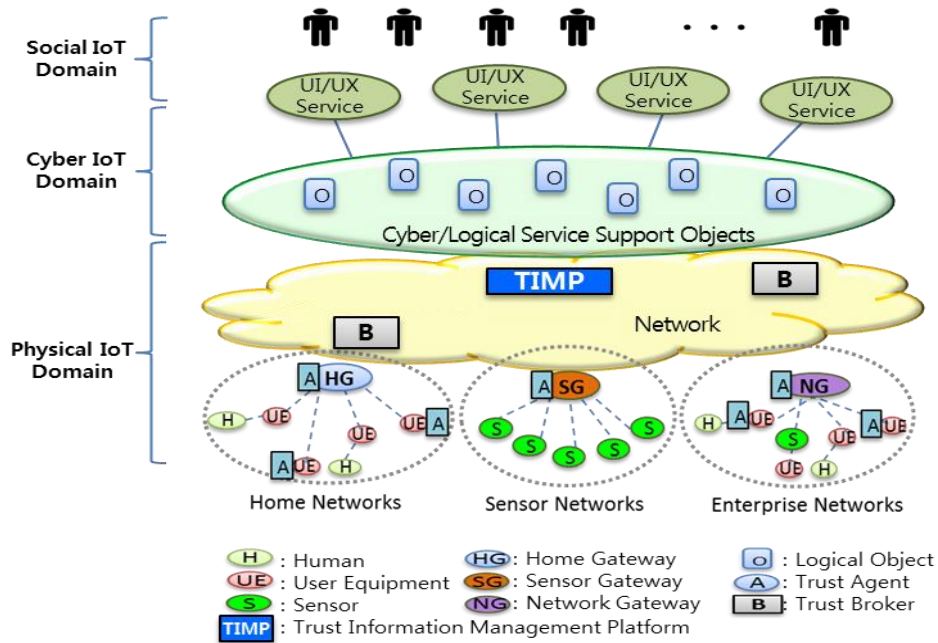


Figure 2. Trust in the physical, cyber and social IoT domains.

260
261

262 Through trust information management, the collected trust data can be further aggregated,
263 classified and analyzed to determine an appropriate level of trust of physical things, cyber objects as
264 well as people. Moreover, it helps people to overcome perceptions of uncertainty and risk, and
265 engages in user acceptance and consumption on IoT services and applications. To provide
266 trustworthy IoT services, all IoT entities including applications, platforms, networks and devices
267 have to properly work together through the service goal.

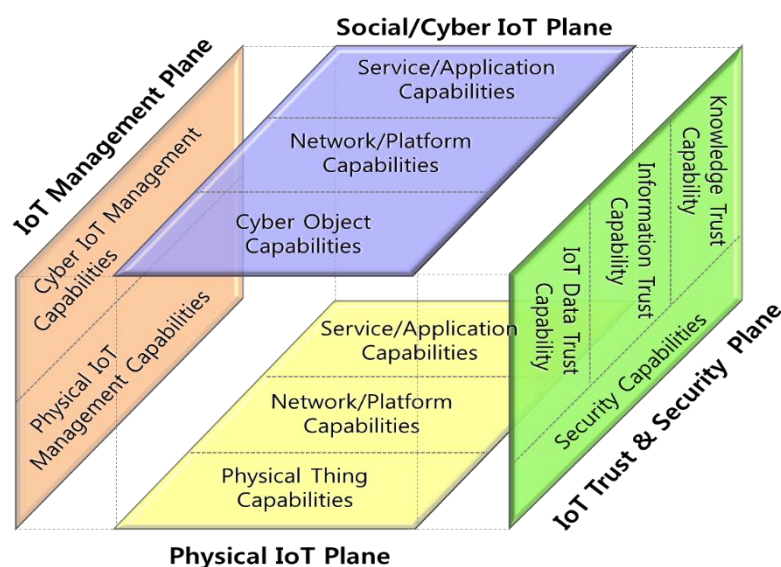
268 In general, there are three IoT domains: (1) the physical IoT domain that perceives the dynamic
269 physical environment, collects and delivers data; (2) the cyber IoT domain that analyzes and process
270 the data from the physical IoT domain, and provides services to users; and (3) the social IoT
271 domain that makes decisions based on IoT data analysis or uses physical IoT devices and cyber IoT
272 services. The physical IoT domain and the cyber IoT domain are substantially different, but both capabilities
273 are connected and affect each other in many aspects of data, control and management. In addition,
274 the users generate social data, information and knowledge by themselves or through interactions
275 among people, and the cyber data and knowledge are generated through the operation of the
276 software and processes of the cyber IoT domain. Likewise, physical data is generated from a terminal
277 at the physical IoT domain. Trust issues such as confidentiality, integrity and availability are
278 important problems of the physical, cyber and social IoT domains that need to be considered [1].

279 As new services closely interact with each other in SIoT, it is necessary to analyze and manage
280 the trust in each domain, and to analyze and manage the cross-domain trust between the other
281 physical, cyber or social domains. In the case of convergence among heterogeneous services in SIoT
282 environment, the trust information in each service must be able to be used in objects and data in other
283 services beyond the service area. In this way, cross-service interactions require structural trust
284 analysis and management for the service domain itself, and methods and procedures for supporting
285 cooperation between trust-based service domains should be provided.

286 The growing use of IoT expects the generation of large volumes of data. Collecting trustworthy
287 data from physical things or cyber objects is the first step to provide trustworthy IoT services and
288 applications. There are a number of different types of algorithms and systems available to extract the
289 information or knowledge from the aggregated data.

290 A trustworthy IoT service depends on reliable cooperation between the different IoT domains
291 as well as each capability in the physical, the cyber and the social IoT domains. In order to develop a
292 trust analysis algorithm, the specification of trust objects and attributes must precede the trust

293 modeling. Here, trust modeling involves designing a trust domain by structuring and shaping trust
 294 data in a form that enables trust inference and interpretation of behavior and state data of users,
 295 devices and services. Furthermore, corresponding trust technologies at each domain should also be
 296 described to collaborate with the IoT capabilities.



297
 298

Figure 3. Generic IoT trust reference model and related capabilities.

299 Reflecting these considerations, a reference model needs to be defined to clarify the relationship
 300 between IoT capabilities and trust capabilities as shown in Figure 3, where IoT trust and security
 301 plane consists of IoT data trust capabilities, information trust capabilities, knowledge trust
 302 capabilities as well as security capabilities. The physical IoT plane consists of physical IoT device,
 303 network and platform capabilities, and the social/cyber IoT plane consists of software capabilities
 304 embedded in devices, networks and platforms. On the other hand, the IoT management plane is
 305 responsible for the operation and management of the capabilities on the physical IoT plane and the
 306 social/cyber IoT plane.

307 3.3. Constraints on data acquisition

308 In order to analyze and provide trust information for people, objects and applications, it is
 309 essential to collect data from public, private, corporate, and commercial areas. In the design of the
 310 trust information management framework, data related to trust should be designed in a way that
 311 reflects the practical constraints such as data silos and personal data protection laws. Service
 312 providers, individuals, corporations, and government agencies maintain and manage data from
 313 economic, social, cultural, and public activities, but these data are not generally allowed to share and
 314 sell because a data collection may involve privacy issues for service users or device owners in most
 315 cases.

316 For example, user data related to media services are very useful to provide customized services
 317 and target advertisements. However, a data collection in the media services imposes serious
 318 constraints and requires trust-enabled mechanisms such as trustworthy data crawling and reasoning
 319 with policies, and some of the data collected by smartphones may contain sensitive information such
 320 as the location data of the owners. Because of these constraints of data collection including user's
 321 privacy and regulations, a data analysis based service basically needs a data usage and protection
 322 agreement.

323 In accordance with these privacy considerations, enterprises and individuals who basically want
 324 to use the trust service should purchase a TIMP using their own trust data, or lease the trust service
 325 in the form of a software-as-a-service (SaaS) cloud to use as a business model. Otherwise, trust
 326 information can also be obtained through the Trust Information Broker (TIB) when trust information

327 about any persons, objects, or application services held by other providers and public institutions is
 328 needed.

329 Trust information is required in many areas, including the commercial domain as well as the
 330 enterprise domain, the private domain, and the public domain. The targets of trust include not only
 331 people but also various objects of social, cyber, and physical fields such as physical objects to be
 332 traded, services on the Internet, and household appliances.

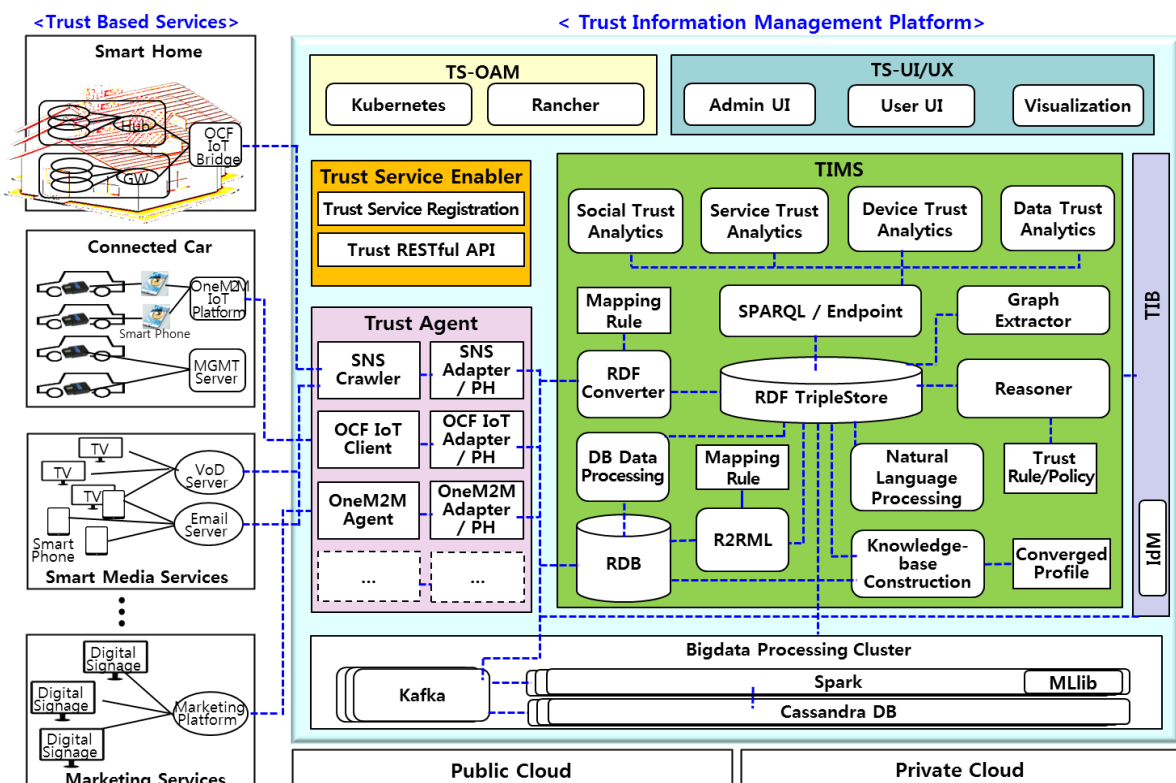
333 However, most of the data from users, devices, and services needed for trust analysis contain
 334 private data of individuals and are linked with sensitive service policies, so it is very difficult to share
 335 these data in each service domain with other services or users. In order to develop and apply a
 336 realistic TIMP to data silos, it is necessary to provide trust information in compliance with such data
 337 silos and privacy restrictions.

338 4. Trust Information Management Platform

339 4.1. TIMP Architecture

340 Considering the trust information management framework described in Section 3, this section
 341 describes the architecture of the proposed TIMP. Basically, it is designed to have a non-dependent
 342 structure for services and applications to be used in various fields. As shown in Figure 4, TIMP
 343 consists of seven subsystems: Trust Service Enabler (TSE), Trust Agent (TA), Trust Information and
 344 Management System (TIMS), Trust Information Broker (TIB), Trust System-Operations,
 345 Administration and Management (TS-OAM), Trust System-User Interface/User Experience (TS-
 346 UI/UX) and Bigdata Processing Cluster.

347



348

349 **Figure 4.** Architecture of trust information management platform

350

351 (1) Trust Service Enabler (TSE)

352 TSE performs the trust service registration from service providers and users requiring trust
 353 information, and it is responsible for dynamically generating and providing TIMS with the following
 354 modules:

- 355 • Trust RESTful API is an interface that enables various trust system modules such as TA, TIMS, TIB,
 356 databases to be registered and managed in TSE. Trust system module providers such as TA, TIMS,
 357 TIB, and databases can receive usage fees based on their usage when their modules registered with
 358 TSE are used for trust services.
- 359 • Trust Service Registration performs the function of dynamically configuring and allocating virtual
 360 TIMS to the service provider by receiving the registration of the trust information service from the
 361 service users and orchestrating the registered trust system modules using the Trust RESTful API.

362
 363 (2) Trust Agent (TA)

364 TA provides a number of interfaces for data collection that can collect IoT and service data from
 365 various types of IoT services such as smart home, connected cars, and smart media with the following
 366 modules:

- 367 • SNS Crawler periodically acquires user data from various social network services such as
 368 Facebook, Twitter, Gmail and so on.
- 369 • SNS Adapter & Privacy Handler (PH) performs the function of anonymizing the user data received
 370 from the SNS crawler and transmitting it to the database of TIMS. Because TIMS stores, analyzes
 371 and manages trust information based on anonymized personal information, it can cope with the
 372 leakage of personal information due to hacking and the like.
- 373 • OCF/OneM2M IoT Clients are IoT data collection interfaces according to the OCF (Open
 374 Connectivity Foundation) standards and OneM2M standards, respectively.
- 375 • OCF/OneM2M IoT Adapter & PH modules anonymize and transfer data collected from the
 376 OCF/OneM2M IoT Client to TIMS similar to the one described in SNS Adapter & PH.

377
 378 (3) Trust Information and Management System (TIMS)

379 TIMS analyzes the data of users, services and IoT devices delivered through TA by using social
 380 network analysis techniques, machine learning-based analysis techniques, natural language
 381 processing techniques, ontology-based analysis techniques, and it performs functions to infer and
 382 manage trust indexes of devices and so on with the following major modules:

- 383 • Social Network Analysis module serves to deduce the trust index among users by analyzing
 384 patterns of communication between users through social network services and e-mails. It uses
 385 ontology methods to share and deliver social network data in a systematic representation format.
 386 Several ontologies such as Friend-of-a-Friend (FOAF) [24] are used to represent social networks.
 387 FOAF ontologies which provide information extracted from user profiles and lists are widely used
 388 to provide portability between social networking sites and to model user-generated information
 389 and content in a machine-readable manner, since they can describe their relationships and online
 390 activities. In addition, Resource Description Framework (RDF)-based social data descriptions
 391 provide a much more effective way of representing online social networks than existing social
 392 network models. In addition, Semantic Web technology is also very useful for improving
 393 information retrieval performance and increasing flexibility in data access.
- 394 • Natural Language Processing module finds information such as stakeholder trust, IoT trust, service
 395 trust and data trust based on text data collected from Facebook, Twitter, and Gmail, and builds a
 396 knowledge base.
- 397 • Service Trust Analysis module analyzes service utilization data in smart home, connected car, and
 398 smart media services, which are generated by the service itself.

399 TIMS uses standard technologies related to Semantic Web for common representation of
 400 heterogeneous IoT data collected in the physical IoT domain and applies linked data technologies for
 401 common representation of trust information in the cyber and the social IoT domains. However, data
 402 in the social/cyber/physical domains can all be converted to RDF format, stored and looked up and
 403 used for trust analysis. IoT and social data collected from services such as smart home, connected
 404 cars, etc. are stored in the NoSQL-based Cassandra database and SQL-based MySQL database, and
 405 are converted and delivered to RDF-based TripleStore. By utilizing this Semantic Web technology,
 406 data on social networks can be integrated with data from other sources to develop more valuable

407 data and information. Furthermore, Semantic Web technology is very effective in knowledge
408 management processes that extract, maintain and develop knowledge.

409

410 (4) Trust Information Broker (TIB)

411 TIB arbitrates trust information for users, services, and IoT devices in other service domains to
412 be received and transmitted through user consent and anonymization processing. Trust identity
413 management (IdM) plays a role to identify whether trust objects of different service domains are the
414 same user because each TIB deduces and manages trust information based on anonymization of
415 user information.

416

417 (5) Trust System-Operations, Administration and Management (TS-OAM)

418 TS-OAM module is responsible for the operation and management of trust system modules
419 using Kubernetes [25] and Rancher [26], which are open source projects that bring cluster
420 management capabilities to the world of virtual machines.

421

422 In order for TIMP to be effectively applied to various services, it is necessary for the user to easily
423 identify user-friendly trust information for nearby IoT devices and services. For administrators, it is
424 important to be able to easily monitor the use of TIMP services and respond quickly to problems.
425 Trust System-User Interface/User Experience (TS-UI/UX) provides a user-friendly visualization
426 interface that can effectively provide information about the trust system to administrators and users.

427 Storing and managing trust information in the IoT data and social network data collected and
428 received in real time in order to extract and analyze the trust information is very disadvantageous
429 from a cost point of view. TIMP adopts distributed big data processing clusters using real-time big
430 data processing engines such as Apache Spark, thereby enabling cheap and fast trust analysis.

431 4.2. Trust Data Analytics Procedure

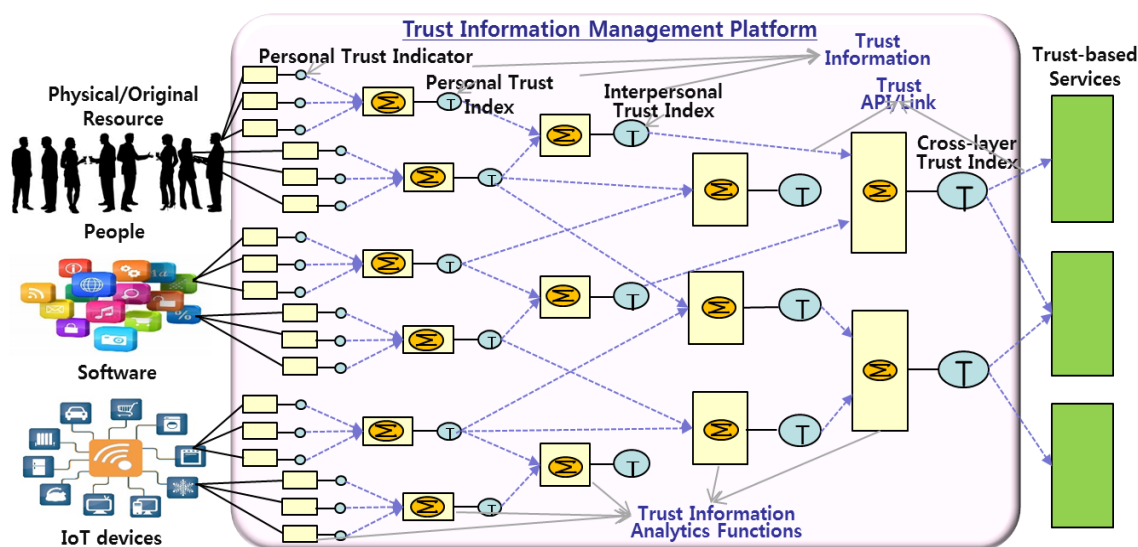
432 As described in Section 4.1., a trust index is quantitatively or qualitatively calculated and
433 measured based on a trust evaluation model, and then used for the decision-making process not only
434 by value-chains among multiple media stakeholders, but also by applications and service
435 transactions.

436 The SIoT environment generally consists of IoT devices installed in homes and buildings,
437 network functions for data transmission, IoT platform functions for analyzing data,
438 services/applications using the analyzed information, and people using them. In this environment,
439 TIBS should be used to analyze the trust information of users, services, and IoT devices themselves
440 and the trust relationship between them. As mentioned in Section 4.1., TIBS has various trust analysis
441 functions such as social network trust analysis function, natural language processing trust analysis
442 function, machine learning based trust analysis function, and semantic ontology-based trust analysis
443 function. Depending on whether the trustee is a person, a service, or an IoT device, a suitable trust
444 analysis function is selected and used in TIBS.

445 For example, a trust analysis of a natural language processing method using text data on a social
446 network service can be used for the trust analysis for the user, and a social network analysis function
447 can be used for the trust relationship analysis between the users. Also, in order to confirm the trust
448 index of the IoT device itself, a machine learning based trust analysis method will be used to
449 determine whether the generated data is in a normal range. The trust relationship analysis of the
450 semantic ontology can be used to identify the trust relationship based on the ownership and usage
451 information between the user and the IoT device.

452 Thus, in order to analyze trust information between users and devices in a general IoT service
453 such as smart home, various trust analysis techniques in TIBS are applied in combination. Here, the
454 trust index between users, the trust index between devices, and the trust index between the device
455 and the user are collected and combined after being individually analyzed. Figure 5 shows a
456 procedural concept in which trust information such as users, devices, and services are collected and
457 combined through subsequent stages to derive a trust index. In most cases, IoT services are a mixture

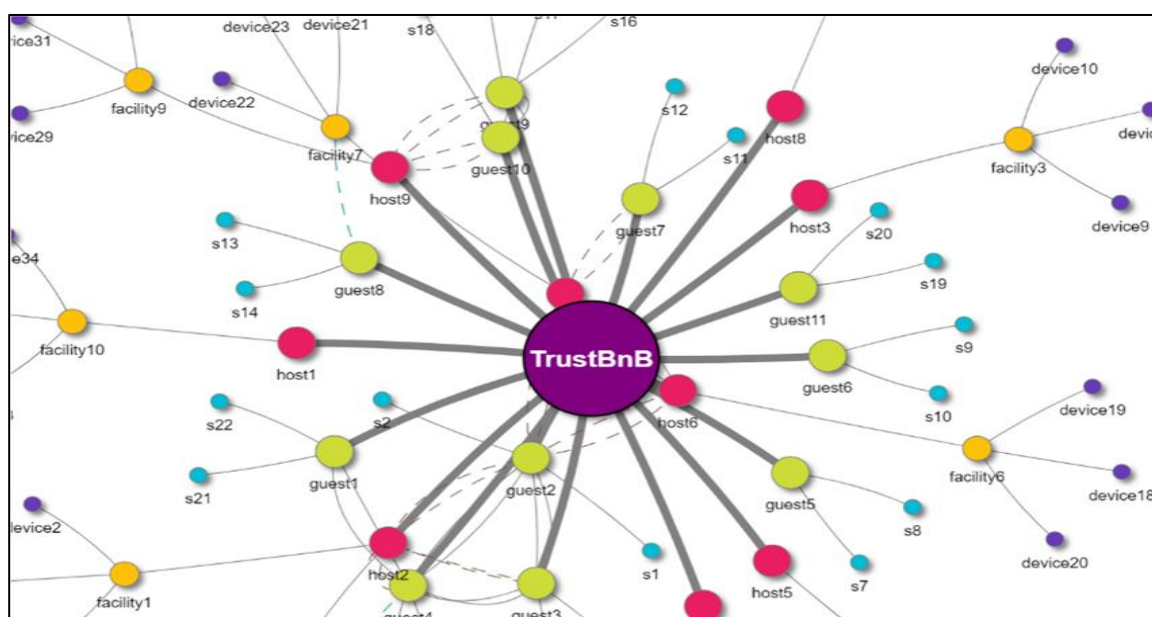
458 of IoT devices, software and user-related functions. Therefore, in analyzing trust for these IoT
 459 services, it is necessary to derive individual trust indicators and indices for devices, software, and
 460 people, as well as cross-layer trust indexes resulting from their interactions.
 461



462
 463 **Figure 5.** The procedure of trust data analytics
 464

465 In TIMS, trust information of a user, a service, a device itself derived through individual trust
 466 analysis functions such as the natural language processing trust analysis function are structured in
 467 RDF format and linked data is stored and managed in the central TripleStore. According to the service
 468 requirement, the individual trust information stored and managed in the TripleStore is reconfigured
 469 based on the service value chain and transaction relationship, and the trust information is
 470 comprehensively calculated.

471 In this way, a direct and indirect trust relationship can be formed between people, services, and
 472 IoT devices. In order to intuitively inform the users of the trust relationship in a variable service
 473 environment, a graphic user interface (GUI)-based visualization is effective. Figure 6 shows the trust
 474 relationship between the users and the IoT devices owned by the user in the service named TrustBnB.
 475 By selecting each path, the trust index between users, services, and IoT devices can be confirmed.
 476



477
 478 **Figure 6.** Trust visualization for trust relationship analysis

479 5. Implementation and Use-case

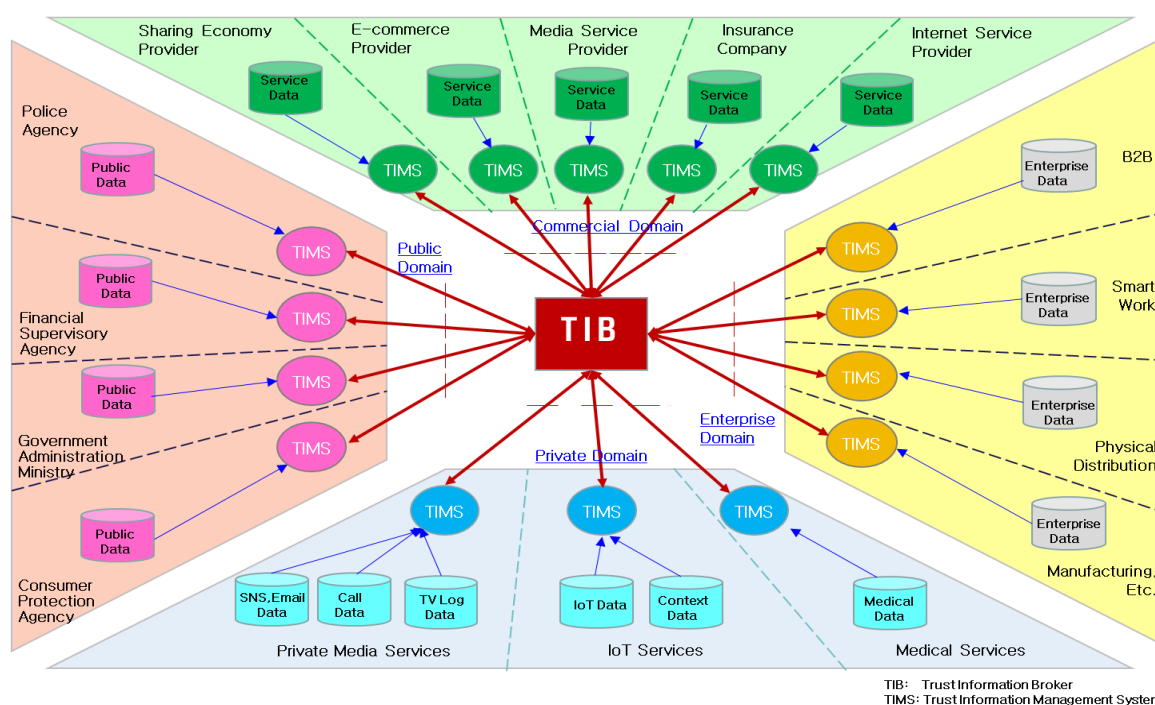
480 In this section, a specific illustration to implement TIMP will be described in detail along with a
481 use case for TIMP-based services.

482 5.1. TIMP Implementation

483 Figure 7 shows an example of how TIMS and TIB are configured and applied to analyze and
484 share trust information in services within each domain of the commercial domain, the enterprise
485 domain, the private domain, and the public domain.

486 The services of each domain should be able to select and configure TIMS's functional elements
487 appropriately to the types and attributes of the data they hold and the types and attributes of the
488 trust information they want to receive. TIMS should be separately available from other service
489 domains and be able to input and analyze users, devices and services related data held by each
490 service.

491 In designing and implementing TIMS for satisfying the needs of each service while reflecting
492 the latest trends in cloud and big data technology, it is a cost-effective way that TIMS uses a common
493 service platform based on cloud computing rather than a proprietary system installed in a separate
494 service domain. By adopting a SaaS approach to cloud computing, service providers will be able to
495 access and use trust information services faster and at lower cost by selecting and configuring TAs,
496 TIMS, and TIB capabilities that are appropriate for itself.



497

498 **Figure 7.** An Example of trust information broker implementation

499

500 Figure 8 shows the snapshot of real system implementation for TSE. On the left side, menus for
501 registering TA, database (DB), TIB, and TIMS constituting TIMP, as well as menus for orchestrating
502 and connecting them are shown. The right screen shows the examples of the configured trust service
503 using the modules registered in TSE according to the trust service request, and detailed parameters
504 information such as Id, URL, and TIMS's API key for the trust service.

505

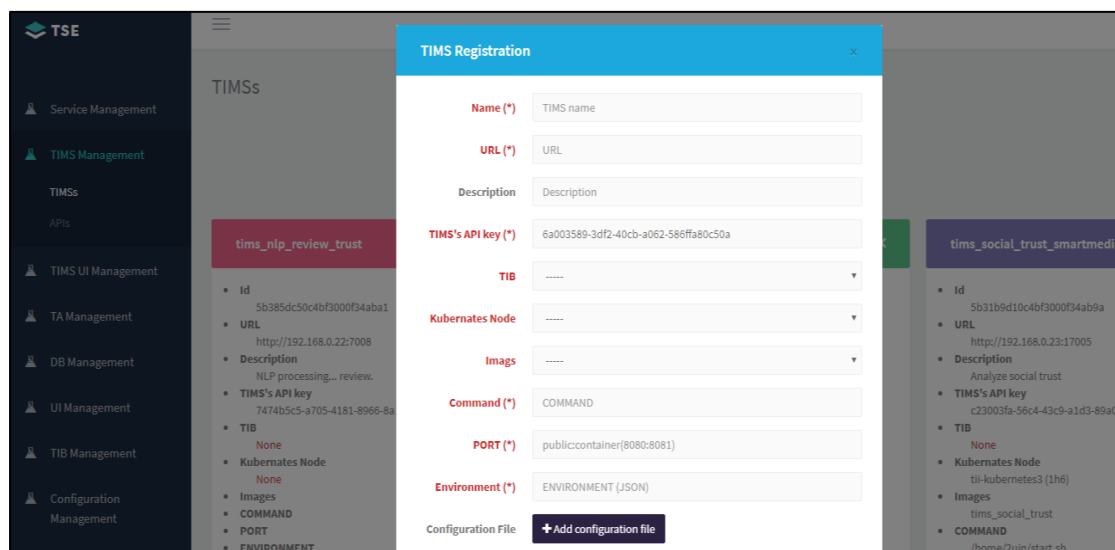


Figure 8. TSE implementation for registering trust systems

506
507

508 5.2. TIMP based Service Use-case

509 As a specific use case with TIMP, we illustrate a TIMS based services with
510 accommodations/offices and automobiles among the "resources" to which the proposed TIMP is
511 applied.

512 A resource sharing service intermediary or broker exists for each field (i.e., accommodations,
513 automobiles, bicycle, facilities, etc.) of a trust-based resource sharing service. This may be
514 implemented in the form of web sites or mobile apps such as Airbnb, Uber, and so on. The resource
515 provider communicates with the web site or mobile application of the service intermediary in order
516 to register a shared resource target (accommodations, automobiles, etc.) to provide renting (or
517 sharing), charges, and other required items, then exchanging information related to the resource
518 sharing service transaction.

519 Instead of a lender (or resource provider) or a tenant (or resource user), a service intermediary
520 is responsible for management such as use permission limitation of resources such as
521 accommodations/office, automobiles, etc. according to a user's trust index.

522 The TIMP can be used for trust-based resource sharing services during the lease period, using
523 IoT technologies. The TIMP, unlike the existing sharing economy approach (e.g., Airbnb, Uber, and
524 the like) that simply links the owner (or lender) of the resource with the user (or tenant), enables a
525 trustworthy service transaction between a resource provider and a tenant, on the basis of the trust
526 information analyzed through accumulated data collected through IoT sensors. The service
527 intermediary may access the user trust information and the resource trust information through the
528 TIMP.

529 The TIMP based resource sharing systems can perform resource sharing transaction including
530 procedures of creating and managing a trust index of a user who uses resources, creating and
531 managing a trust index of resources, and controlling the use of resources based on the user trust index
532 and the resource trust index.

533 To achieve the trust-based service transaction, the method of utilizing trust information of a user
534 and trust information of a resource itself is applied based on various technologies, such as IoT, smart
535 home, etc., which is done between a resource provider (e.g., owner, manager, lender, and the like)
536 and a resource user (e.g., tenant, and the like) through a resource sharing service intermediary that
537 operates a sharing service web page or application system.

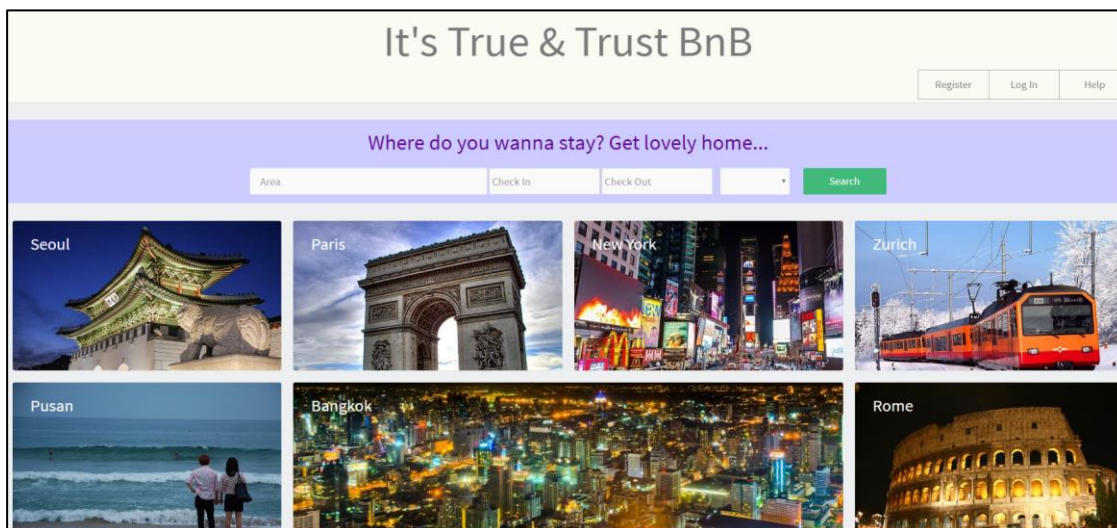
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539 The procedure to provide TIMP-based resource sharing services is as follows:

- 540 • Based on the past offer history and the reputation on its use or the trust information at the time of
- 541 resource registration, the resource provider undergoes a verification process for the service target
- 542 (or shared resource) and the charge.

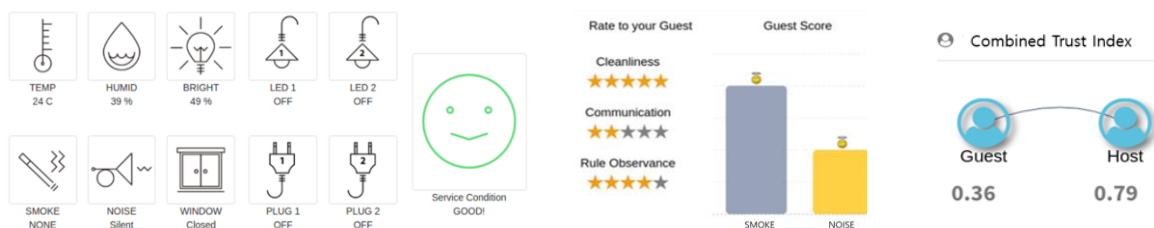
- 543 • Setting a minimum user trust index necessary for use permission of the user when the provider
- 544 provides a resource; and comparing a user trust index set by the provider with a trust index of a
- 545 user to use the resource to control the use of the resource in response to the comparison result.
- 546 • TIMP collects resource use status information from the resource and analyzes IoT data from the
- 547 collected resource to determine whether contract violation, resource failure, or safety problem
- 548 occurs; and a procedure of, when it is determined that contract violation, resource failure, or safety
- 549 problem occurs while the user uses the resource, notifying this to the provider or the user.
- 550 • The resource user exchanges information with the service system of the service intermediary;
- 551 inputs a target resource, a location, a number of users, and the like; searches for an available
- 552 resource; and exchanges various service transaction information. At this time, the user inputs the
- 553 required trust level of the resource to be used.
- 554 • After the user selects one of the listed resources and makes a reservation, when visiting the
- 555 accommodations or taking over the automobiles at the scheduled time, the user uses the resource
- 556 according to the contract details.
- 557 • TIMP generates and manages a trust index of a user using the resource by checking IoT data on
- 558 resource management status (e.g., energy usage, whether a door is locked or not, smoking, etc.)
- 559 during a resource use period. It can examine whether the service contract is actually observed
- 560 through an IoT function (e.g., smoking, whether the number of contracted person is exceeded,
- 561 safety observance, etc.).
- 562 • TIMP analyzes the trust information as follows:
- 563 . Setup of functional goals of analysis algorithms;
- 564 . Type of analysis: System Trust, Personal Trust, Interpersonal Trust (Social Interaction);
- 565 . Filtering and priority decision on trust information;
- 566 . Selection of trust analysis algorithm appropriate for each entity's type of trust information:
- 567 Example 1) Rule-based, Machine-Learning-based algorithms in the case of users and
- 568 resources themselves; Example 2) In the case of user relationship, Graph-based, Interaction-
- 569 based algorithm; Example 3) Summing for heterogeneous trust analysis algorithm.
- 570 • TIMS calculates a user trust index by adding objective use status data collected from IoT sensors
- 571 and subjective data from a resource provider and by reflecting past history between the user-
- 572 resource provider entities.
- 573 • TIMP controls the use of the resource based on the user trust index and the resource trust index. It
- 574 can limit the use of the resource of the user when the comparison result indicates that the trust
- 575 index of the user to use the resource is lower than the trust index for the resource permission set
- 576 by the provider.
- 577 • TIMP updates the trust information based on the feedback from the user and the resource provider,
- 578 such as re-adjusting the trust index of the corresponding user and the trust index of the
- 579 corresponding resource.

580
581 Figure 9 shows an accommodations service system depending on a trust-based resource sharing
582 service. It should be understood that the system structure of Figure 8 organically combines the service
583 intermediary and TIMP to provide trust-based accommodations renting services between an
584 accommodations provider and a tenant.
585



586
587 **Figure 9.** An example of TIMP based resource sharing services (an accommodation service)
588

589 We conducted trust analysis and evaluation of a Trust BnB service in a sharing guest house as
590 shown in Figure 10. Figure 10 (a) below shows the status of IoT devices in a Trust BnB service.
591 Through IoT devices, it is possible to objectively check the trustworthiness of the guest, such as
592 whether the guest has complied with the accommodation contract. Figure 10 (b) represents the host's
593 subjective evaluation of the guest, and Figure 10 (c) shows the guest's and host's trust index, which
594 combine objective trust analysis and subjective evaluation.
595



596 (a) Objective trust analysis with IoT devices (b) Subjective trust evaluation (c) Trust index
597 **Figure 10.** Trust analysis and evaluation at Trust BnB
598

599 Although this section has been described with reference to the illustrations of
600 accommodations/office resources, the technical scope of TIMP may be applied to other resources such
601 as bicycles, various facilities, instruments, furniture, and so on.

602 Trust information in a resource sharing service can be utilized in terms of each entity as shown
603 in Table 1:

604 **Table 1.** Usage of user or resource trust information

From the viewpoint	Usage of user or resource trust information
Resource provider	<ul style="list-style-type: none"> - Set the minimum user trust index of a user who is allowed to use provider's resource (e.g., select from 1 to 5 stars). - Resource use permission only for a user to be trusted. - Suggest differentiated charges and resource use options according to a user trust index (e.g., For five-star graded user, free internet and free parking with 50 dollars accommodations rental fee; For three-star graded user, 60 dollars accommodations rental fee and another extra fee for convenient facilities.).

Resource user	<ul style="list-style-type: none"> - Trust index of a resource is able to be checked through a trust-based resource sharing service. - Only the desirable resource of a trust index is selected by filtering a trust index in a resource use reservation search window. - Resource use is possible with better conditions in the future through observing the resource use rule (or contract) and enhancing the user trust.
Resource sharing service intermediary	<ul style="list-style-type: none"> - Provisions of differentiated resource use fees and options according to trust index when in the service system operation. - Trust-based resource use service system is configured with a trust index matching method between both sides (e.g., resource provider and user). - In order to increase a user trust index, a user is encouraged to comply with contract during resource use. - For a provider, a resource trust index is recognized as the factor of increased revenue to raise efforts to manage users and resources.

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Rewards such as rate discounts and option changes are provided for future service provision and use, through trust information accumulated and updated for users and resources. This allows resource users to use resources cleanly and safely and provide motivation on user and resource management efforts to resource providers, so that it is possible to enable trust-based virtuous circle ecosystem. In addition, if necessary, by sharing the trust information of the user, accumulated through the trust-based resource sharing service, with other services and the third party through the TIB, trust services may be linked and spread.

Note that our implementation and demonstration results based on the international standard ITU-T Y.3052 [11] have been tested and certified from the Telecommunications Technology Association (TTA), Korea, as part of results from the previously conducted Trust Information Infrastructure (TII) project.

617

6. Conclusion

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In this paper, we have targeted emerging SIoT environments that will activate the entirety of the production and distribution of goods and services throughout the ICT industries and the economy by combining the hyper-connectivity provided by IoT and the technologies assuring trust of the physical things and the cyber objects. After designing a trust information management framework, we have proposed TIMP which enables trust-based reliable and stable services by verifying and providing trust information for data, devices, services and users in SIoT environments where people, objects and services interact frequently. We have implemented core components, including trust data processing and analytics in TIMP and demonstrated a use case for TIMP-based services.

Implementing and deploying TIMP enable to build a trustworthy ecosystem while activating SIoT businesses by reducing the transaction costs as well as by eliminating the uncertainties in the use of IoT services and data transactions. In the future, it is necessary to timely implement and spread TIMP technologies to all ICT applications and services so that economic ecosystem formation and transaction structures can be dramatically improved.

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 645 paper.

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