

Guest Editorial

Special Issue on Fog Computing in the Internet of Things

FOG COMPUTING (FC) is an emerging research area that targets on providing services and satisfying customers' needs in the space between "Ground" and "Cloud." In the current cloud-based Internet of Things (IoT) model, smart devices (such as sensors and smartphones) exchange information through the Internet (routers and/or servers on cloud) to cooperate and provide services to users, which could be citizens, smart home systems, and industrial applications. The cloud-based IoT model describes a uniform, concise, and scalable solution for supporting IoT applications. The deployments of IoT applications on cloud, however, are facing the challenges originated from economic considerations, social concerns, technical limitations, and administrative issues.

There is no doubt that the big data generated by things are surprisingly useful. Fog consists of all the smart computing/sensing systems that are around us and tied together. Typically, it includes a small data center that is placed close to the things in IoT. FC is probably the most promising technology to support IoT applications while simultaneously and successfully addressing all the aforementioned challenges and issues. It adds a new dimension to the IoT model for meeting the customers' needs such as fast connection, strong security, easy management, infrastructure reuse, off load core network traffic, and quick scaling. FC is expected to support a wide range of IoT applications, including device-to-device data sharing, wearable cognitive assistance, video editing and sharing, vehicular systems, etc. To address the arising new challenges and opportunities, we have planned this feature topic issue to help both industry and academia research communities better understand the recent advances and potential research directions on the converging paths of IoT and FC.

The papers in this feature topic issue focus on the state-of-the-art research and the grant challenges in various aspects of FC for IoT. We solicited papers covering various topics of interest, and received a total of 42 submissions. After a rigorous peer review process, ten papers were accepted.

In the paper entitled "LoDPD: A Location Difference-Based Proximity Detection Protocol for Fog Computing," proximity detection is investigated. The authors first perform a theoretical and experimental analysis of the existing solutions; then they propose a location difference-based proximity detection

protocol based on the Paillier cryptosystem, which outperforms the traditional protocols in terms of communication and computation costs.

The survey paper entitled "A Survey on Internet of Things: Architecture, Enabling Technologies, Security and Privacy, and Applications" conducts a comprehensive overview of IoT from the aspects of system architectures, enabling technologies, and security and privacy issues. It presents the integration of Fog/Edge computing and IoT. The survey begins with exploring the relationship between cyber-physical systems and IoT. Then the Fog/Edge computing-based IoT is introduced. At last, applications such as smart grid, smart transportation, and smart cities, are presented to illustrate how Fog/Edge computing-based IoT can be implemented.

Some security and privacy issues in FC-based face identification are investigated in the paper entitled "Security and Privacy Preservation Scheme of Face Identification and Resolution Framework Using Fog Computing in Internet of Things." A security and privacy preservation scheme is proposed considering authentication and session key agreement, data encryption, and data integrity checking. A prototype system is illustrated. It is shown that the proposed scheme can effectively preserve security and privacy in FC-based face identification.

In the paper entitled "Securing SDN Infrastructure of IoT-Fog Network From MitM Attacks", the authors investigate the potential threats of man-in-the-middle attacks on the OpenFlow control channel in software-defined networking, which can automatically and dynamically manage network flows for IoT. A feasible attack model in an IoT-Fog architecture is first introduced. The severe consequences of the corresponding attacks is shown. Furthermore, the authors propose a lightweight countermeasure using Bloom filters. A prototype for this method is also implemented. The evaluation results demonstrate that the proposed Bloom filter monitoring system is efficient and consumes few resources.

The paper entitled "Feasibility Study of 60 GHz Millimeter-Wave Technologies for Hyperconnected Fog Computing Applications" carries out the feasibility study of the interference impacts in advanced FC networks with the 60 GHz millimeter-wave wireless technology. This performance simulation study investigates whether utilizing the 60 GHz millimeter-wave wireless technology for hyper-connected FC networks is feasible or not considering various interference scenarios. As validated by the simulation

results, it is shown that 1.5 Gb/s high rate can be supportable even though more than 1000 edge devices are deployed in the 100 m-by-100 m size small-scale network. Thus, it is confirmed that hyper-connection can be realized with the 60 GHz millimeter-wave technology for FC networks.

The authors of the paper entitled “Fog-Empowered Anomaly Detection in IoT Using Hyperellipsoidal Clustering” study anomaly detection for IoT applications. The traditional anomaly detection methods suffer from significant latency and energy consumption issues. The authors propose a novel anomaly detection method, called Fog-empowered anomaly detection, by harnessing the processing power of the FC platform and using an efficient hyperellipsoidal clustering algorithm. The authors also define three types of anomalies in the Fog architecture. The evaluations toward both synthetic and real datasets demonstrate that the proposed method achieves a significant reduction in latency and energy consumption compared with the traditional methods, while achieving a comparable detection accuracy.

In the paper entitled “QoS-Aware Deployment of IoT Applications Through the Fog,” a simple yet general model is proposed to support the QoS-aware deployment of multicomponent IoT applications to Fog infrastructures. In the proposed model, the issues regarding operational systemic qualities of the available infrastructure, interactions among software components and things, and business policies are addressed. Several algorithms that can be used to determine eligible application-to-Fog deployments are also proposed. Furthermore, a prototype Java tool based on the proposed model is introduced.

The paper entitled “Identifying the Most Valuable Workers in Fog-Assisted Spatial Crowdsourcing” focuses on worker selection in spatial crowdsourcing. A spatial crowdsourcing task relies on worker’s effort and skill. In order to maximize the long-term platform utility, the paper exploits the Fog platform as a service to identify valuable workers through learning their performance data. The proposed worker selection scheme takes into account balancing exploration and exploitation attempts. An online algorithm is proposed to promote workers who are not fully explored. The proposed algorithm can be used to maximize the long-term platform utility with budget constraint. The authors perform theoretical analysis and derive that the proposed algorithm achieves asymptotically diminishing regret. Extensive simulation results based upon real-world datasets are also presented to demonstrate the advantage of the proposed algorithm.

The paper entitled “Computing Resource Allocation in Three-Tier IoT Fog Networks: A Joint Optimization Approach Combining Stackelberg Game and Matching” considers a specific FC network with a set of data service operators (DSOs), each of which controls a set of fog nodes (FNs) to provide data service to a set of data service subscribers (DSSs). The problem of how to allocate the limited computing resources of FNs to all the DSSs to achieve an optimal and stable performance is investigated. The authors propose a joint

optimization framework for all FNs, DSOs, and DSSs to achieve the optimal resource allocation schemes in a distributed manner. In this paper, the pricing problem for the DSOs and the resource allocation problem for the DSSs are addressed through formulating a Stackelberg game. A many-to-many matching game is employed to investigate the pairing problem between DSOs and FNs. Another layer of many-to-many matching between each of the paired FNs and serving DSSs is employed to solve the FNDSS pairing problem within the same DSO. The simulation results are presented to show that the proposed framework can significantly improve the performance of the IoT-based network systems.

A resource allocation strategy for FC based on priced timed Petri nets (PTPNs) is proposed in the paper entitled “Resource Allocation Strategy in Fog Computing Based on Priced Timed Petri Nets.” With the proposed strategy, users can choose the satisfying resources autonomously from a group of preallocated resources. The proposed strategy considers the price cost and time cost to complete a task comprehensively. Moreover, it considers the credibility evaluation of both users and fog resources. The PTPN models of tasks in FC are constructed according to the features of fog resources. An algorithm for predicting task completion time is presented. The method of computing the credibility evaluation of fog resource is also proposed. Furthermore, a dynamic fog resource allocation algorithm is presented. The simulation results demonstrate that the proposed algorithms can achieve a higher efficiency than the static allocation strategies in terms of task completion time and price.

We are very grateful to all the authors for their great contributions to this feature topic issue, and to all the reviewers for their excellent job in providing timely and rigorous reviews. Special thanks go to Dr. C. Wang and Dr. X. Shen, the two Editors-in-Chief of the IEEE INTERNET OF THINGS JOURNAL, for their help in the whole publication process. We expect that this feature topic issue can help both industry and academia research communities better understand the recent advances and potential research directions on the converging paths of IoT and FC.

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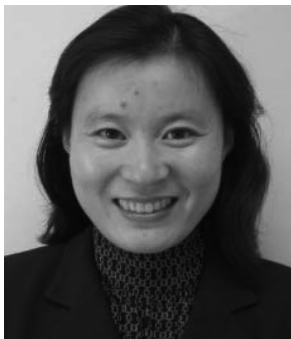
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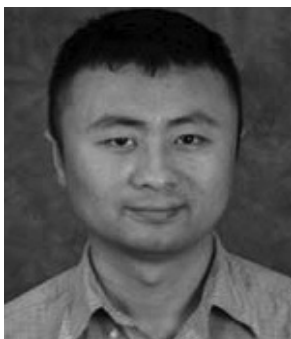


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