## A Vision of Fog Systems with Integrating FPGAs and BLE Mesh Network

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Abstract --- This paper presents a novel integrated fieldprogrammable gate arrays (FPGA) and Bluetooth Low Energy (BLE) mesh system in the field of fog computing. Combining the merits of 1) programmability of FPGAs, and 2) wide-area communication and low-energy consumption of BLE mesh technology, this platform will create a diverse range of applications such as low-latency computation at the network edge, as well as showing a demo for Internet-of-Things (IoT) connections to cover an entire building. By integrating FPGAs, more important, the fog node can offer a great potential for flexible acceleration of many workloads and improve power efficiency with more hardware parallelism than CPUs and GPUs. These advantages are going to move FPGAs into the mainstream of fog computing for the foreseeable future. The preliminary results of a BLE mesh network is demonstrated on http://sceweb.sce.uhcl.edu/xiaokun/#-> project. Generally we provide three test cases: to control the mesh network by local device, local server, and cloud server. It can be observed that the feedback control from the local device achieves the lowest latency, and the response delay from the cloud server is the highest. Therefore, it is necessary to pre-process more than 90% raw data from sensor network at the proximity of the network edge/fog, particularly with the number of IoT devices in tens of billions levels

*Index Terms*—Bluetooth Low Energy (BLE) mesh, Fog computing, Internet-of-Things (IoT).

## I. INTRODUCTION

The growth in Internet-of-Things (IoT) is explosive, impressive, and is likely to overwhelm traditional storage systems and cloud servers. It is a big challenge for today's data centers to process such a large volume of data available from sensors, controllers, monitors and other devices. Hence a new computing paradigm, fog computing, is originally coined by Cisco as an enabling technology allowing computation to be performed at the proximity of data sources [1]. Generally, as shown in Fig. 1 the fundamental idea of fog computing is that instead of uploading all the raw data into the cloud servers/centers, more than 90% of sensing data will be pre-processed or filtered at the network edge/fog. It has several benefits compared to conventional cloud-based computing paradigm, such as low-latency response, wise usage of bandwidth, as well as data security and privacy [2].

#### IoT Hardware Ecosystem



#### Fig. 1. Cloud-Fog-IoT system

Under this context, this paper focuses on presenting a novel fog system with reconfigurable field-programmable gate array (FPGA) accelerators and the Bluetooth Low Energy (BLE) network using the latest CSRmesh technology [3], [4]. The specific contributions are as follows:

- FPGA in general provide more hardware parallelism than is possible with software-based applications, so tasks executed in hardware will be more efficient on an FPGA than in software on a GPU or CPU. Motivated by this consideration, in our proposed architecture FPGAs will be integrated with the CSRmesh servers as computation accelerators.
- Second, instead of sending sensing data to cloud servers directly, our proposed edge system allows computation to be performed at the proximity of data sources. It has several benefits compared to conventional cloud-based computing paradigm, such as high-speed response, low throughput required for cloud computing, as well as data security and privacy due to analyzing data inside the local network.
- To test the system on a number of devices, the BLE mesh solution is adopted to deploy an IoT network and address the cost-energy-range limitations. We believe that the combination of mesh and BLE technology will be one of the keys to many wide-area and low-bandwidth network applications, capable of providing a low-cost and low-energy way (10% of Wi-Fi and Zigbee) to network together an almost unlimited number (65535 per group) and unlimited range (×relays) of Bluetooth enabled devices [4]. The mesh technology has not been released in the

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Bluetooth standard yet, hence we manufacture and customize some BLE development boards by using BLE modules provided by the CSR vendor.

The organization of this paper is as follows: section 2 briefly reviews the motivation and related works of our proposed system, and section 3 illustrates the challenges of the future fog computing. In section 4, the proposed work is introduced, and in section 5, the future work is discussed. Finally, section 6 concludes this paper.

#### II. PRIOR WORKS AND MOTIVATIONS

The basic idea of this work comes from the optimized Microsoft Bing architecture published in 2016 [5], [6]. Basically Bing reaps the benefits in two ways: 1) by embedding a  $6 \times 8$  torus of high-end Stratix V FPGAs into a half-rack of 48 machines, the throughput is increased by  $\times 2.25$ , which means that fewer than half as many servers would be needed to sustain the target throughput at the required latency (as shown in Fig. 2 (a) [5]); 2) because the FPGA is able to process requests while keeping latencies low, it is able to absorb more than twice the offered load while executing queries at a latency that never exceeds the software data center at any load (as an example shown in Fig. 2 (b) [5]).



Fig. 2. Performance of microsoft bing system with and without integrating FPGAs [5]

Given that FPGAs show promise for accelerating many computational tasks, we propose a novel system by offloading some complex algorithms, such as deep learning [7], high performance computing [8]-[10], data encryption and decryption [11], [12], and energy minimization [13], [14], from CSRmesh server to an FPGA coprocessor.

In addition, our previous works [15] and [16] demonstrated a smart system where it is possible to utilize intelligent analytics to filter sensor data, provide new insights, and improve decision making. In this paper we focus on presenting a vision with integration of FPGA and BLE mesh technology, as well as showing a prototype of a BLE mesh system with the latest CSR1020 modules. Comparing with the prior works in [15], [16] employing CSR1010, the CSR1020 chip optimizes the resource cost and is able to provide 15 GPIO (12 GPIO for CSR1010) which is more extendable by combing with FPGAs.

## **III. CHALLENGES OF FOG SYSTEMS**

In this work we 1) focus on discussing two challenges of fog computing and bringing forward one of the potential solutions; and 2) demonstrate our idea with a prototype of a low-energy CSRmesh network.

## A. Wide-area, Low-cost, and Low-energy Communication of the IoE Layer

Because of the expected boom in IoT with smart agriculture, industrial IoT, smart city, and such wide-area applications, there is a strong interest in developing widerange communication solutions within an IoT/fog system. Second, in addition to the desired property of low energy consumption, the hardware must be inexpensive and ease of use.

To address the cost-energy-range limitations, the CSRmesh solution will be adopted in our proposed system as a case study. Since billions of existing devices have been compatible with Bluetooth technology for many years, we believe that the combination of mesh network and Bluetooth Low Energy (BLE) technology would be regarded as a key to many large-area and lowbandwidth network applications, capable of providing a low-cost and low-energy way to network together an almost unlimited number and unlimited range of Bluetooth enabled devices [4].

# B. Programmability and Power Efficiency of the Fog Node

Homogeneity is highly desirable for fog nodes to reduce management issues and to provide a consistent platform that applications can rely on. In other words, fog servers need continued improvements in performance and efficiency, but cannot obtain those optimizations from general-purpose systems and non-programmable hardware.

Hence, in our proposed system the reconfigurable architecture—FPGA, will be integrated in the fog layer to improve the flexibility of the fog system. More important, FPGA in general provide more hardware parallelism than is possible with software-based applications, so tasks executed in hardware will be more efficient on an FPGA than in software on a MCU or CPU.

#### **IV. PROPOSED ARCHITECTURE**

In this section, a vision of fog systems containing a cloud layer, a fog layer, and an IoT layer is introduced, and furthermore, a prototype of the physical/network layer is demonstrated

#### A. A Vision of the Framwork

As a case study, Fig. 3 reports the main blocks that compose a fog system. First of all, an FPGA board is expected to provide the needed interfacing-pluscomputing support by nearby fog nodes. The main block is an Arbiter to direct different types of data to the optimal place for analysis. Different channels will be considered as different priorities, such as:

- Math acceleration: the most time-sensitive data is analyzed on the FPGA at the edge of the network;
- Data filter channel: data that can wait seconds or minutes for action is passed along to the fog servers for analysis and action;
- Data compression: data that is less time sensitive is compressed and sent to the cloud for historical analysis, bid data analytics, and long-term storage.

In addition, to test this system on a number of devices, we deploy a CSR mesh network that can detect and analyze environment data such as humidity and temperature, and then make a decision to feedback control the actuators or send valuable information to fog/cloud servers. Three interfaces are offered to communicate with the network: cloud server control, local server feedback, and accessing by local devices. In the future, we will focus on reducing the computation latency by offloading workload to FPGAs. By sensing and automating our surrounding environment, the application will create many practical improvements in our lives, increasing our convenience, health, and safety, while at the same time improving energy efficiency and speed.



Fig. 3. Proposed fog system

## B. Self-fabricated CSRmesh Boards

As per a full vision shown in Fig. 3, in this paper we concentrate on demonstrating that an IoT mesh network with sensors and actuators is actually feasible and practical. While the BLE mesh standard has not been published yet and currently only a few vendors have it available in the market, we select CSR (one of the earlier vendors) Bluetooth models to manufacture the demo boards [4], which is shown in Fig. 4.



Fig. 4. Self-fabricated boards using CSR1020 modules

More specifically, we employ APlix CSR1020 modules for fabricating four development boards [17], and then establish a BLE mesh network. In addition to the basic operations such as sensing and actuating devices, more important, this prototype also shows a BLE starmesh integration topology to extend the connectivity range to more than 100 feet [15], [16].

As customized devices, we create our own specification for the host/server and three devices. The control packets for LED, sensor, motor are illustrated in Fig. 5 (a)-(d), and the data packet received from the sensors is depicted in Fig. 5 (e).

The LED can be configured as 256 colors by sending a data packet with data type as hexadecimal "F1", and can be switched ON/OFF by transmitting hexadecimal "F2" through the CSR mesh host/server. Similarly, the motor is controlled by data type of "F4", and the humidity and temperature data will be collected with sending commands of packet type "F3".

rieucei	Size	Type	onon	rteu	oreen	Diuc	Checker	Stop
2	1	1	1	1	1	1	1	2
FA, F5	07	F1	00~01	00~FF	00~FF	00~FF	XX	0D, 0A
		(	a) LE	D Contr	ol Pack	et (TX)		
Handar	Cine	-	Trans	On	OF	Chaster	0	in the second
2	5120		1 ype	1	on		2	top
- FA, F5	04		F2	00~	-01	XX	0	D, 0A
		(	b) LE	D On/O	ff Pack	t (TX)		
Header	Size		Type Se		ing data Checker		Stop	
2	1		1	1	Sing data	1	2	op
FA, F5	04		F3	00~	-01	XX	01	D. 0A
,		(0	) Son	sor cont	rol Dack	ot (TV	)	5, 011
		(0	<i>)</i> 301				,	-
Header	Size	Туј	be	Direction	Strengt	h Ch	ecker	Stop
2	1	1		1	1	1		2
FA, F5	05	F4		00~01	00~05	XX	C	0D, 0A
		(0	i) Mo	tor conti	rol Pack	et (TX	)	
Header	Size	Туре	Hu	midity	Temp	oerature	Checker	Stop
2	1	1	2		2		1	2
FA, F5	07	F3	000	0 ~FFFF	0000	~ FFFF	XX	0D, 0A
		(e)	) Ther	mal/hur	nidity d	ata (RX	5	

Fig. 5. Transmitting and receiving data packets

The fourth field in Fig. 5 (e) represents the humidity and the fifth field indicates the temperature. Each of the field spends two bytes of the whole packet. To convert the hexadecimal data into humidity, we create an equation as

Humidity (h3-h2-h1-h0)

$$=(h3 \times 4096 + h2 \times 256 + h1 \times 16 + h0)/10 \times 100\%$$
(1)

where h3-h2-h1-h0 represents the four hexadecimal data, from the most significant four bits to the least significant four bits. For example, if the received humidity data is hexadecimal "0292", the humidity will be  $(2 \times 256 + 9 \times 16 + 2)/10 \times 100\% = 65.8\%$ .

Similarly, let t3-t2-t1-t0 denote the sixteen bits of the hexadecimal temperature, which is shown in the fifth field in Fig. 5(e). Then the temperature can be obtained by using the following equation:

In equation (2), we define the most significant four bits as the sign bit of the temperature, "0001" meaning negative and "0000" meaning positive. As an example, if the receiving data is hexadecimal "010D", the temperature can be computed as  $(1 \times 256 + 0 \times 16 + 13)/10 = 26.9$  Celsius.

Furthermore, we define four data packets for testing or checking the UART connection and CSR mesh network. As shown in Fig. 6, (a)-(b) depict the detecting commands. Packet type "AA" denotes the UART connection checking and the packet type "AB" indicates the mesh network checking.

Fig. 6 (c)-(d) show the received packets in regard to the connection and network status. In Fig. 6 (c), if the receiving data in the fourth field is hexadecimal "55", the UART is normally connected. Otherwise the UART is disconnected. Likewise, when the receiving data in the fourth field in Fig. 6 (d) is hexadecimal "01", the mesh network is indicated as normal status. Otherwise the network is disconnected.



Fig. 6. Prototype

The specification is created for developing the physical layer of an IoT ecosystem shown in Fig. 3. The main contributions are, 1) we provide a simple and inexpensive way to connect together a large number of devices to establish a mesh network. The communication area can be dramatically extended over intermediate relays. 2) In order to further extend the IoT host/server as a highperformance edge/fog computing node, we develop an external I/O connector with self-defined commands on the host board. By connecting the other heterogeneous resources with the host board, the computing workload can be offloaded to such as FPGAs, GPUs, and other MCU components to improve the system speed and create many future applications.

## V. A PROTOTYPE OF THE CSRMESH NETWORK

In order to test the response latency, three different control channels are used to configure the mesh network. The benchmark is that the raw data available from humidity and temperature sensors in the mesh network is collected by the IoT host/server. After analyzing the sensor data, the host engine is able to automatically make a decision to control the irrigation and lighting systems, which are simulated as a motor and LED.

More specifically, the first demonstration is to access the mesh network by local devices for filtering the raw data and feedback control the network. As an example shown in Fig. 7, the threshold of temperature and humidity is set as 26.5 celeries and 75%, respectively. The LED will be turned to green color when the sensing humidity is lower than 75%. Otherwise the LED sustains in red color. The motor is controlled by the received sensing temperature. If the temperature is greater than 26.5 celeries, the motor/fan will be turned on, otherwise off.



Fig. 7. A feedback control system

The second test is to control the mesh network by Gizwits APP through accessing GoKit servers. As shown in Fig. 8, by employing the GoKit board we are able to connect with the GoKit server, and then feedback control the three LED and the actuator ON/OFF.



Fig. 8 Demo of network control by GoKit server

The final test is to configure the mesh network through the locals servers provided by our research lab. As shown in Fig. 10 (a), the sensing data can be displayed on the demonstration webpage in real time. Additionally three buttons are created to control the LED as three typical colors: red, green, and blue, which is shown in Fig.10 (b). The demonstration is depicted in Fig. 10(c).

```
http:
fry:
print("\nRunning.")
web_color = json.load(urllib2.urlopen("http://sceweb.sce.uhcl.edu/xiaokun/...#"))[0]["color"]
if (web_color == "Red"):
ser.urite(led_red)
led_value = color_r
elf(web_color == "Greem):
ser.urite(led_green)
led_value = color_g
elif(web_color == "Blue"):
ser.urite(led_blue)
led_value = color_b
except KegboardInterrupt
inter.sleep(1)
exit()
(b) LEDD exerter[forwardLand]
```

## (b) LED control from webpage FPGS-CSRmesh (FC) / Fog Computing (FC) Demo

FC System Demo.

Please contact Dr. Xiaokun Yang (yangxia@uhcl.edu) for the FC system demo.

Static control:
© Red <sup>®</sup> Green <sup>©</sup> Blue
MotorOn MotorOff
itic sensing the environment:
iow shows the data from one of the thermal/humidity sensors in the FC system
led, 12:05:04 on Apr 19, 2018 (Central Daylight Time) Humidity : 60.5% & Temperature : 24.8 Celsiu 'urrent Temperature : 24.8 & Set Temperature : 26> LED: Green
led, 12:05:05 on Apr 19, 2018 (Central Daylight Time) Humidity : 60.6% & Temperature : 24.8 Celsiu Jurrent Temperature : 24.8 & Set Temperature : 26> LED: Green
led, 12:05:06 on Apr 19, 2018 (Central Daylight Time) Humidity : 60.6% & Temperature : 24.8 Celsiu Lurrent Temperature : 24.8 & Set Temperature : 26> LED: Green
(c) Demo of network control

Fig. 9. Demo of network control by local servers

Finally, the comparison of the response latency is summarized in Table I. It can be observed that the local host achieves the lowest latency since the computation occurs at the network edge. And the feedback control from the GoKit server obtains the longest delay due to the access with cloud servers. All the prototypes are available on http://sceweb.sce.uhcl.edu/xiaokun/#-> project either by videos or by demonstrations.

TABLE I: RESPONSE	LATENCY O	F THREE	CHANNELS
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Test Cases GoKit server	Response Latency High
Local server	Medium
Local host	Low

### VI. FUTURE WORK

The integration of traditional edge/cloud servers with FPGAs is one of the solutions to design a new generation of products to address emerging workloads in IoT. As a case study, thus, in this paper we provide a specific FPGA-CSRmesh vision in the field of edge/fog computing and hope this prototype will gain attention from the community and inspire more research in this direction. To the best of our knowledge, no technical contributions have been published on the actual FPGA integrations of the BLE mesh network.

The topic is novel and timely with the emerging IoT technology. We believe that in the coming future many wide-area wireless communication protocols (maybe the extension of Bluetooth 5.0 [18]) and FPGA/GPU based fog/edge computing platform, will be standardized and

supported by industry and academy. This prototype is thus likely to create a big impact to the design of such systems by enabling simple and effortless interactions across the vast range of connected devices.

## VII. CONCLUSION

This paper presents an innovative FPGA-CSRmesh platform with three main contributions: 1) an FPGA integration is able to offload and accelerate tasks to improve power efficiency and reduce cost; 2) CSR mesh network provides a simple and inexpensive way to network together an almost unlimited number of BLE enabled devices; 3) since no gateway or router is needed in the mesh network, it not only saves considerable cost and ease the deployment process but also protects sensitive IoT data by analyzing it inside the local network. IoT is becoming a reality when a large amount of sensors and equipment can securely and intelligently connect and interoperate, and can be efficiently and securely processed by fog/cloud nodes. Our proposed system is able to automatically control hundreds of different devices in a large mesh network, right from the programmable and high-speed fog node without having to have a ubiquitous Wi-Fi connection typically required for other IoT platforms. This especially helpful in factory, rural or agricultural environments for applications such as industrial IoT and smart farming. This platform is thus likely to make some changes to the IoT ecosystems in a profound way when the connected devices is in tens of billions levels.

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