

## Hardware Assisted Secure Data Aggregation and Analysis

**Prime Offeror:**

The University of Texas at Dallas  
800 W. Campbell Rd.  
Richardson, TX 75080-3021  
DUNS Number: 80-018-8161  
CAGE Number: 0W921 FICE 009741

**Technical contact:**

Dr. Murat Kantarcioglu  
Computer Science Department – EC31  
Voice: (972) 883-6616  
Fax: (972) 883-2349  
Email: muratk@utdallas.edu

**Technical contact:**

Dr. Zhiqiang Lin  
Computer Science Department – EC31  
Voice: (972) 883-4244  
Fax: (972) 883-2349  
Email: zhiqiang.lin@utdallas.edu

**Administrative contact:**

Emily Lacy  
Office of Sponsored Projects – AD15  
Voice: (972) 883-2041  
Fax: (972) 883-2310  
Email: emily.lacy@utdallas.edu

**Estimated Cost:** \$50,000  
**Period of performance:** 12 Months

# 1 Overview

**Motivation.** Most of the organizations today store increasing amounts of sensitive data collected from various sensors to deliver various value added services. At the same time, there are increasing concerns related to the security, privacy and accountability of such collected sensitive sensor data. In the last couple of years, many data theft incidents have been reported due to various reasons including unpatched software, insider attacks, compromise of the underlying operating system, weak passwords, improper system configuration, lost unencrypted backup etc. [3]. For example, computers attached to the Internet can easily get infected by malwares. Once infected these programs can easily monitor all types of data activity and transfer these sensitive information to the outsiders. Also, attackers could easily use some bug or badly configured software to access critical data. Once the attacker controls the servers processing the sensitive sensor data, all the sensitive data could be accessed by the attacker and confidential data could be leaked without being detected. Therefore, it is imperative to develop a practical solution that can collect and process the sensor data securely under various attacks such as insiders, etc.

**State-of-the-Art.** The most straightforward and also practical way is to encrypt the data sent by sensors during transit and at rest. However, this often leads to another challenge — how to perform data processing over encrypted data, especially in the cloud settings. Over the past decades, numerous techniques have been proposed to support basic computations over encrypted data. From the security perspective, the most notable of such techniques is the fully-homomorphic mechanism (FHE) that can support any computation over encrypted data [2] revealing nothing other than potentially the size of the output. FHE, however, remains extremely expensive and difficult to use as a basis for secure data outsourcing.

Most recently, there also has been a great attention from system community of using the newly introduced Intel Software Guard eXtension (SGX) [7] to achieve trusted computing including data secrecy protection and integrity. At a high level, SGX allows an application or part of an application to run inside a secure *enclave*, which is an isolated execution environment. SGX hardware, as a part of the CPU, protects the enclave against malicious software, including the operating system, hypervisor, or even low-level firmware code (e.g., SMM) from compromising its integrity. This *isolation* enabled by SGX is particularly useful in cloud computing environments, where customers cannot control the infrastructure owned by cloud providers. Consequently, initial exploration into secure execution has begun for cloud settings. Haven [1] pioneered the idea of enabling unmodified application binaries to run on SGX by utilizing an OS library [5]. VC3 [6] suggested privacy-aware data analytics on Hadoop in the cloud.

**Proposed Research.** Much like Intel VT-x that has made virtualization practical, we believe Intel SGX will highly likely make secure and trustworthy computing such as sensor data processing in a hostile environment practical.

In this project, our goal is to protect the confidentiality and integrity of the sensor data used in mission-critical applications by leveraging recent advances in secure hardware design such as Intel software guard extension [4]. Basically, SGX [4] is an instruction set extension that makes it possible to create protected execution environments called enclaves. These enclaves are protected by the processor. Therefore, the processor will not allow any attempt to read or write the memory of a running enclave from outside (e.g., even OS cannot access the enclave memory). Using these enclaves, small amount

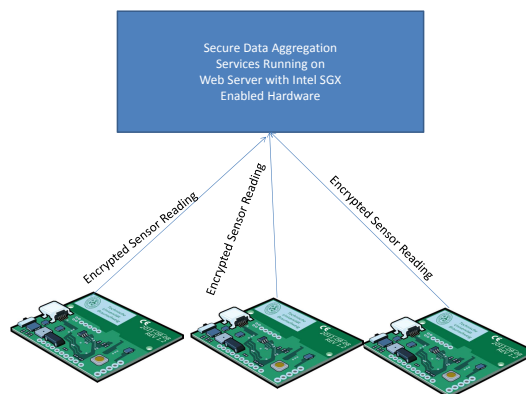


Figure 1: The architecture of our proposed system.

of code can be executed inside the enclave and can be used to process encrypted sensor data collected securely and efficiently.

In our architecture, as shown in Figure 1, each sensor will be sending encrypted data to web service running in the enclave. Enclave based web service will be aggregating the incoming data (e.g., computing certain statistics, basic data mining models, generating alarms/actions based on predefined rules). In addition, computed results and aggregated data will be stored in encrypted format on the server storage. One of our goal in this project will be to design enclave based web services that are self-contained to prevent certain attack scenarios (e.g., disclosure due to potential side channel attacks).

**Deliverables.** Our deliverables include: 1) Initial design of the web service that can run in the Intel SGX enclave securely. 2) Software prototype that can do few basic data aggregation services on simulated sensor data (based on the industry partners feedback will extend it to few real sensors). 3) Documentation that explains the design and coding details.

**Timeline.** We plan to finish the initial design in 3 months, development of the basic prototype in 6 months after the design phase, and experimental evaluation during the last 3 months of the project.

## References

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- [7] Intel software guard extensions (intel sgx) sdk support.