

# 신뢰/기밀 컴퓨팅 개요

## CySecLab (Cyber Systems Security Research Lab)

강병훈

Brent ByungHoon Kang, Ph.D.,

May 27, 2021

# Intro. to Confidential Computing in the Age of AI

**CySecLab**  
(Cyber Systems Security Research Lab)

강병훈

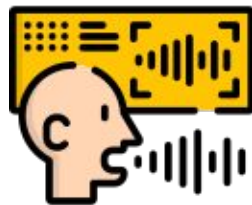
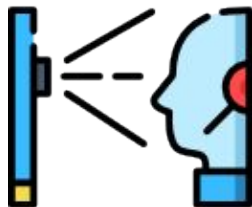
Brent ByungHoon Kang, Ph.D.,

May 27, 2021

# 인공지능 기반 응용 서비스의 기초 요소들

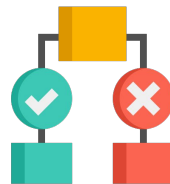
## 인식

이미지, 얼굴, 언어, 음성



## 판단/연관/유추

의료 진단, 악성코드 공격 판별, 상품 제안



## 예측

범죄방어, 금융시장, 의료 예측



# 개인정보 데이터에 기반한 인공지능 서비스

## Healthcare data



Medical images

(e.g., X-rays, CT)



Medical history



Medication privacy

## Highly personal private data



SSN



GPS



Criminal records



## Collective learning



Privacy-preserving data analysis



AI/ML (machine learning)



Federated analytics

## Financial analytics



Expenses



Salary



Capital

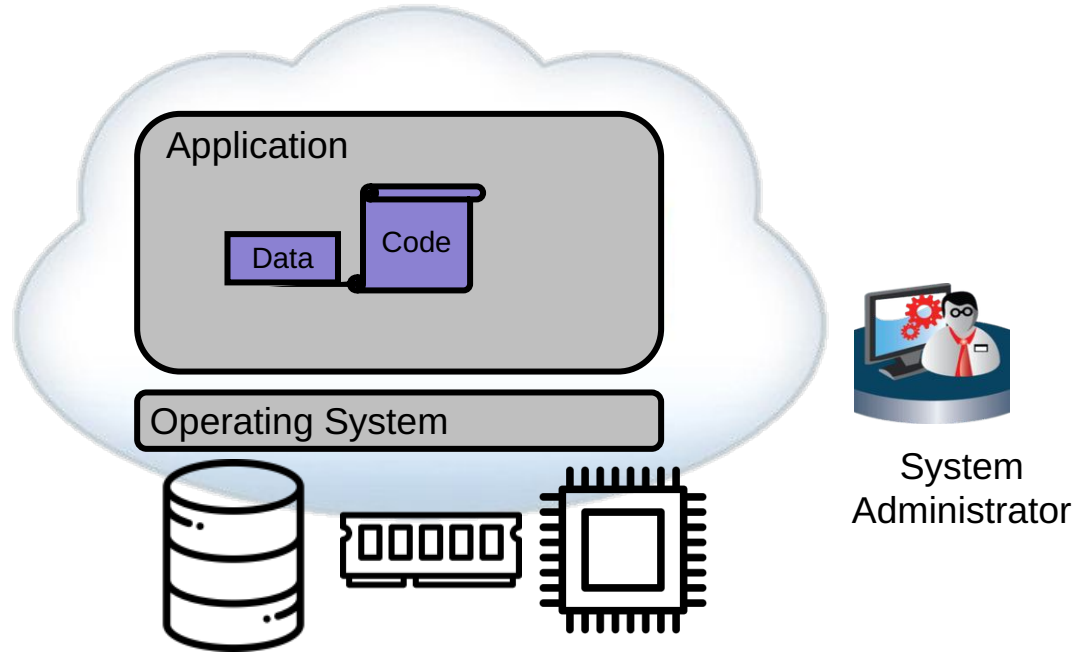
# 인공지능 기반 어플리케이션 및 서비스 시스템

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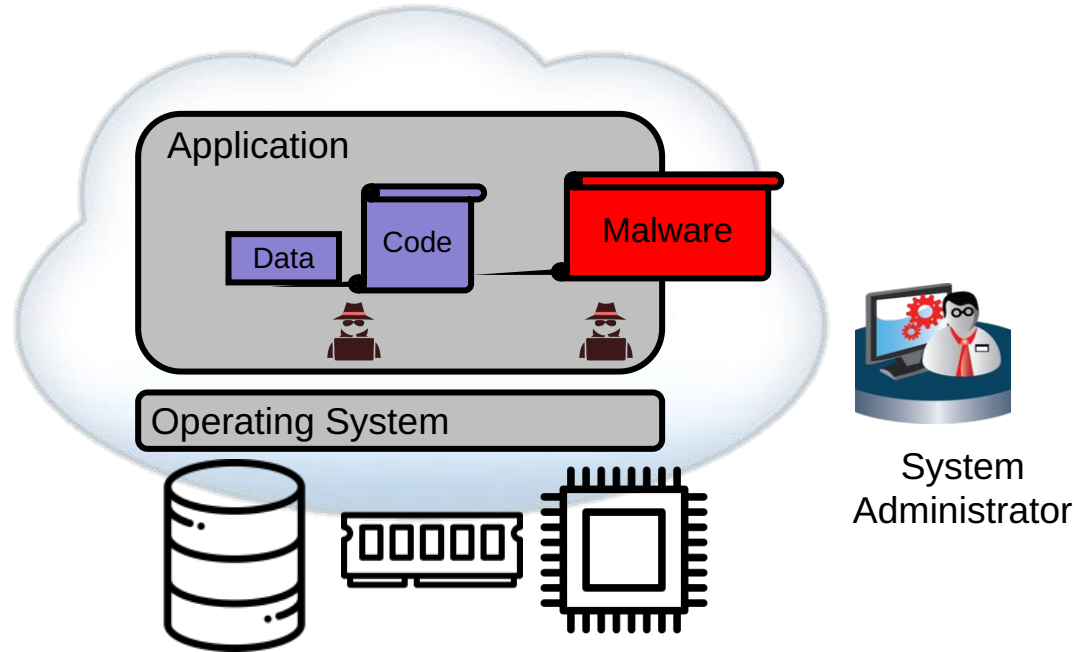
# Applications and Platform Systems

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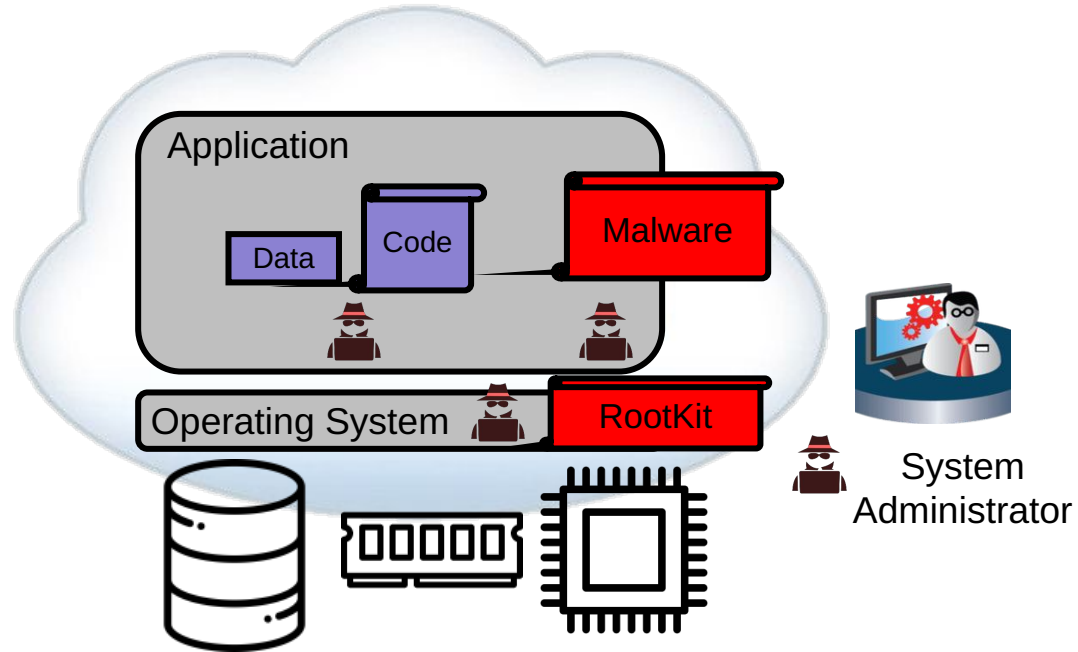
# Vulnerable Applications and Malwares

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# Vulnerable Applications, Systems and Malwares

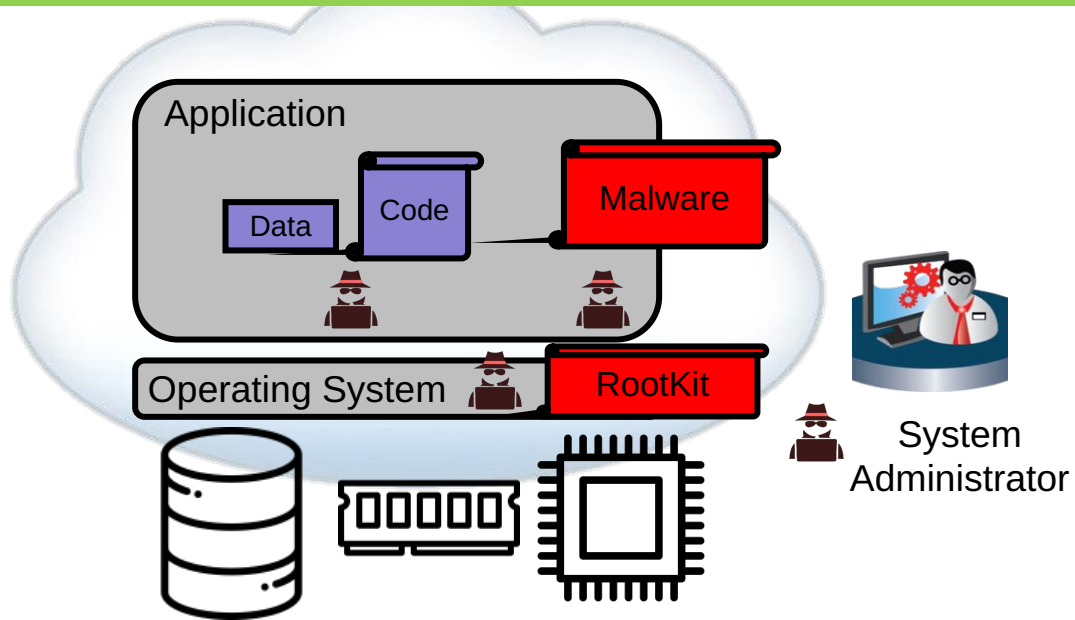
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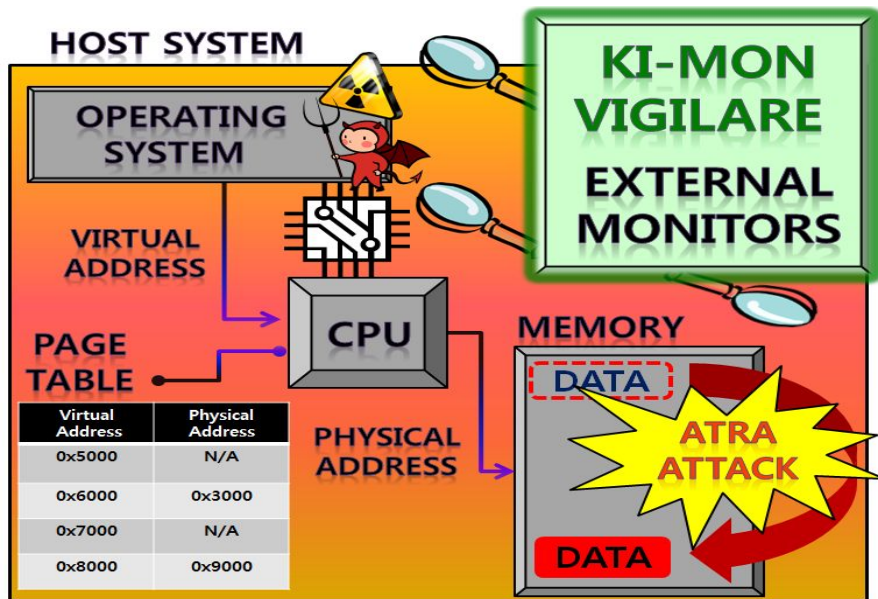


# Vulnerable Applications, Systems and Malwares

<<궁극의 질문 1.>>  
악성코드 없는 세상이 가능할까 ?



# Platform System Integrity Monitor

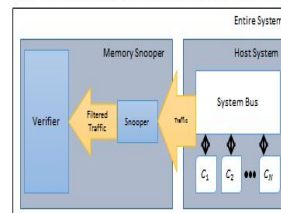


[http://breakthroughs.kaist.ac.kr/?post\\_no=163](http://breakthroughs.kaist.ac.kr/?post_no=163)

## ● 연구 결과 적용 사례

- 삼성 스마트 TV 보안 시스템(GAIA)에 연구 결과 적용 및 탑재
- 삼성 사업부 소프트웨어 보안 솔루션에 Anti-Emulation 탐지 방어기능(2018년), 힘 취약점 공격 방어기술(2017년)

### Bus snooping-based attack detection



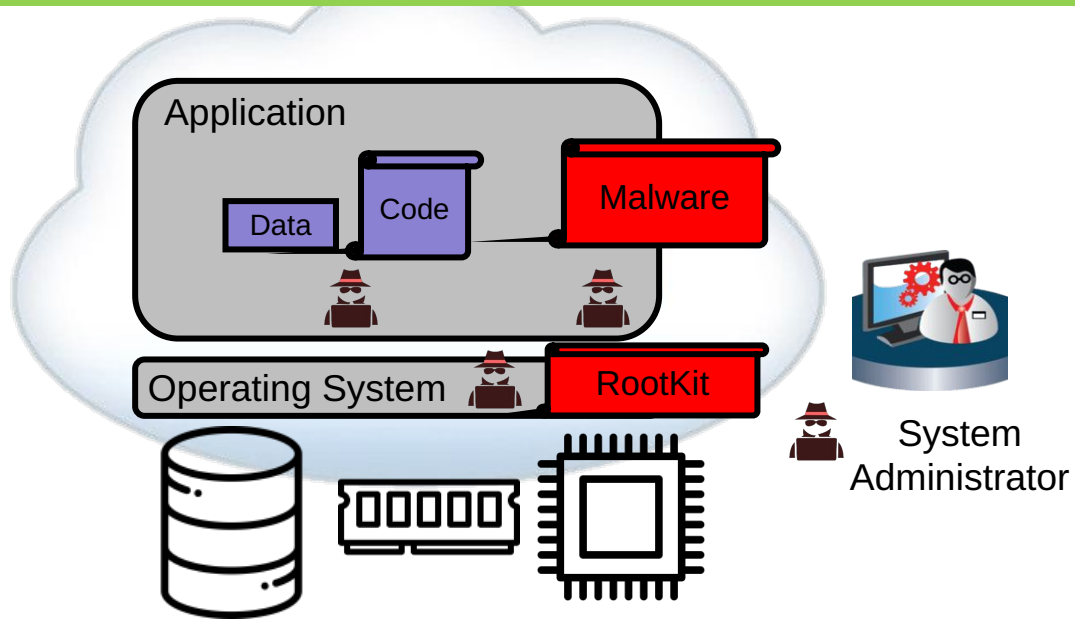
Integrated as part of Samsung's security solution



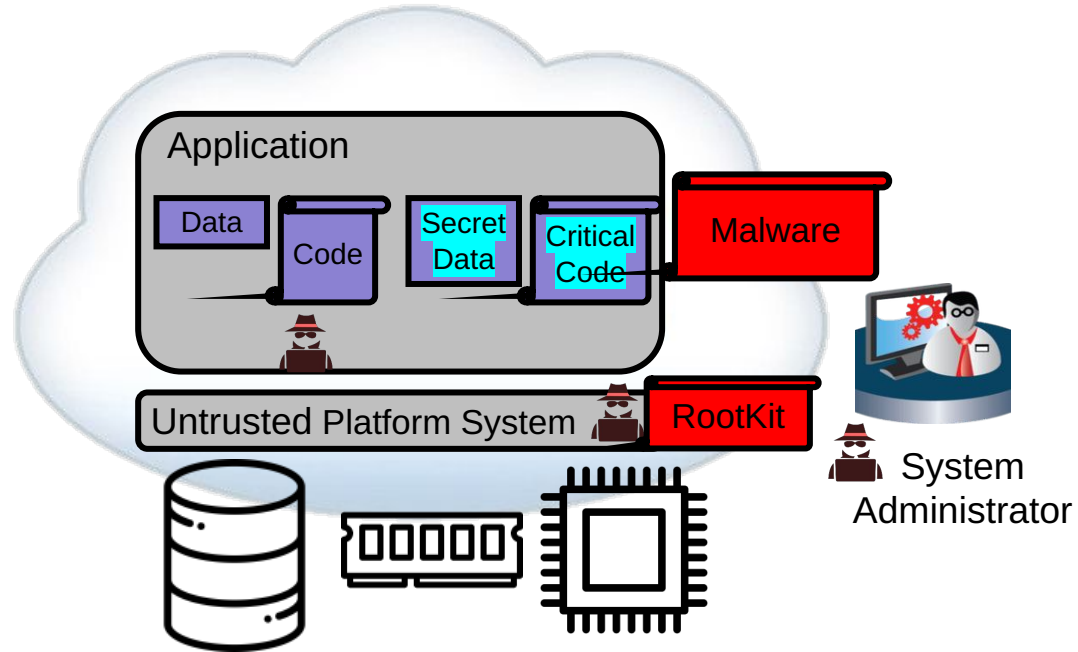
# Vulnerable Applications, Systems and Malwares

<<궁극의 질문 2.>>

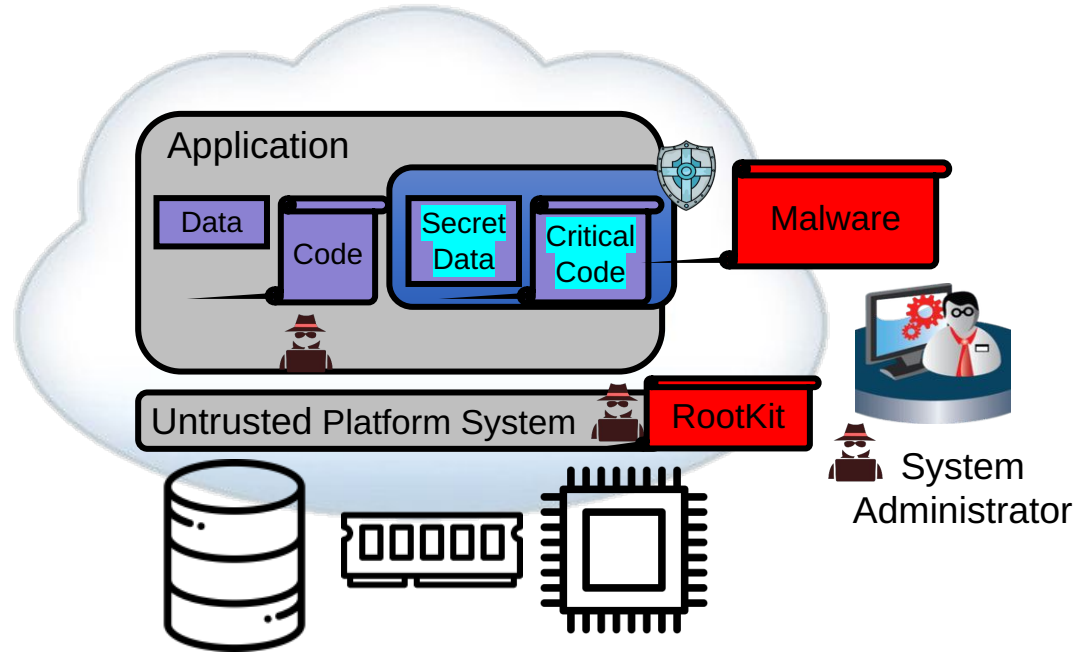
악성코드가 있어도 상관없이 안전한 컴퓨팅 세상이 가능할까 ?



# Secure Isolation of Application

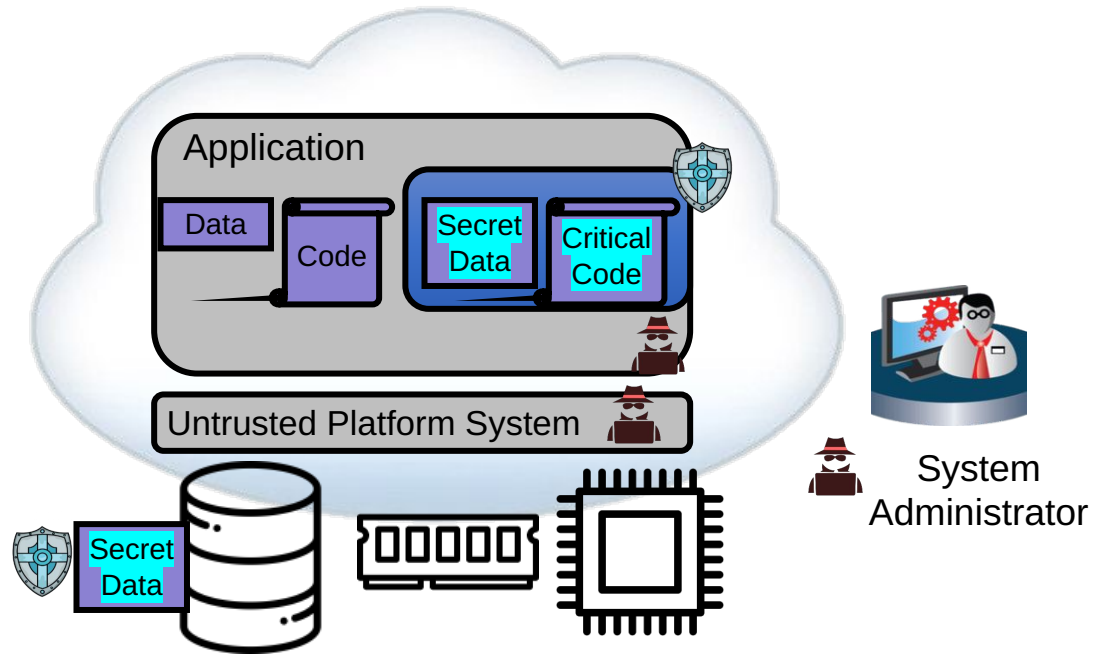


# Secure Isolation of Application

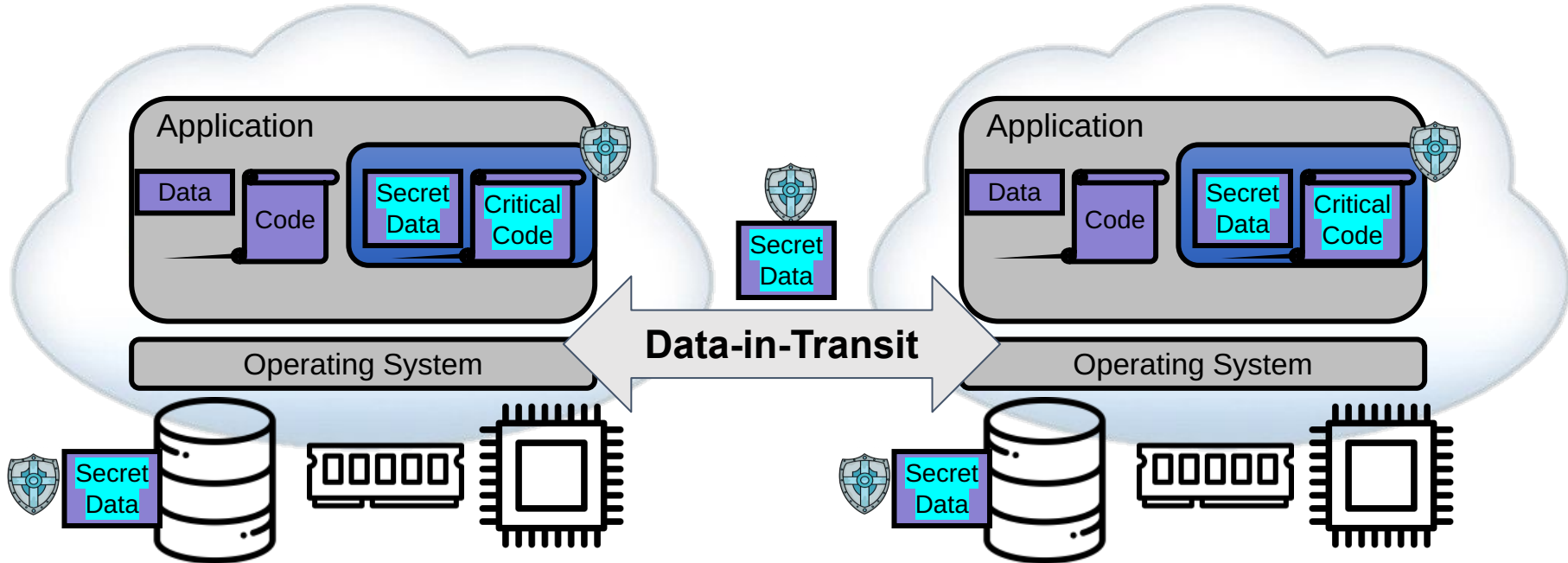


# Data-at-Rest Protection

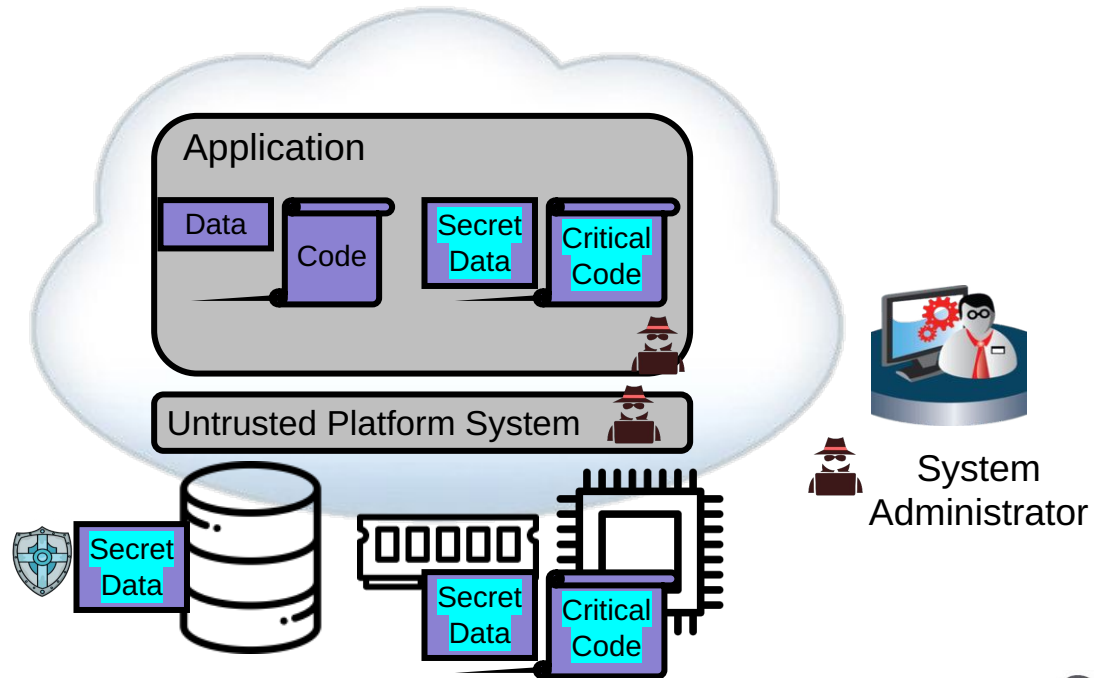
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# Data-in-Transit Protection

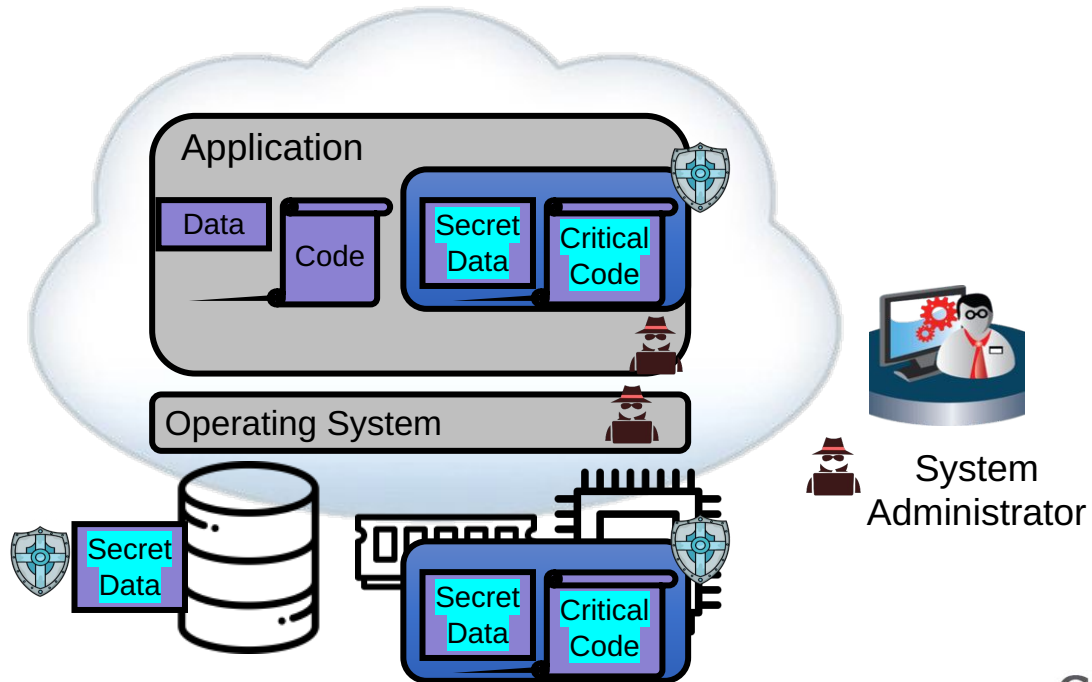


# Data-in-Use Protection





# Data-in-Use Protection: Confidential Computing



# Trusted Confidential Computing (신뢰 기밀 컴퓨팅)

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# TEE (Trusted Execution Environment) 하드웨어 아키텍처

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## ❖ External hardware security module

- Example: TPM, SIM card or a Smart card
- Advantages
  - ✓ High level of tamper resistance and physical security
- Disadvantages
  - ✓ Power efficiency and performance of the device
  - ✓ Reliant to the less secure software outside of the smartcard
  - ✓ Providing a smart card alongside with the main SoC is expensive



# TEE 하드웨어 아키텍처

## ❖ Internal hardware security module

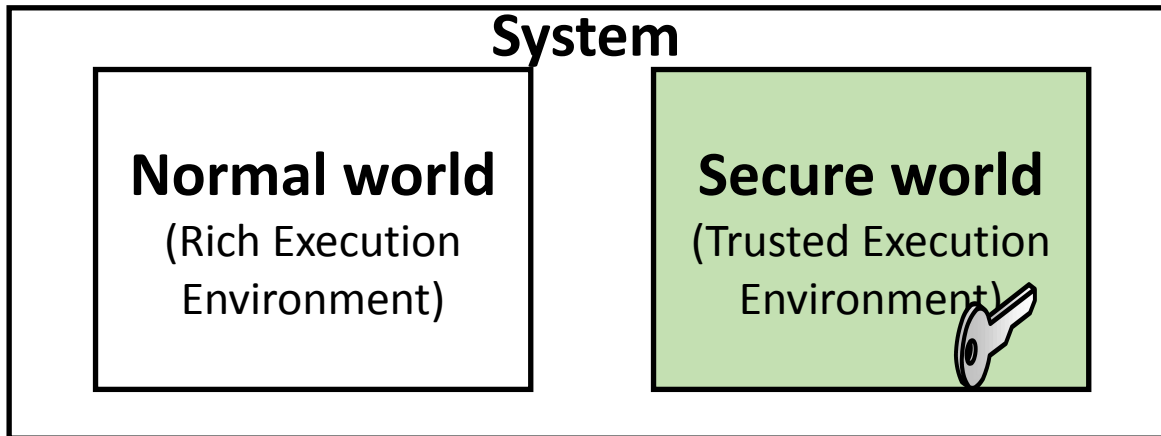
- Example
  - ✓ A hardware block for cryptographic operation and key storage
  - ✓ General-purpose processor dedicated to the security sub-system
- Advantages
  - ✓ Cost reduction (compared to the external)
  - ✓ Performance improvement
- Disadvantages
  - ✓ Restricted perimeter (e.g. only for cryptography)
  - ✓ Less powerful than main processor
  - ✓ Time & energy consuming for inter-processor communication
  - ✓ Complex SoC design



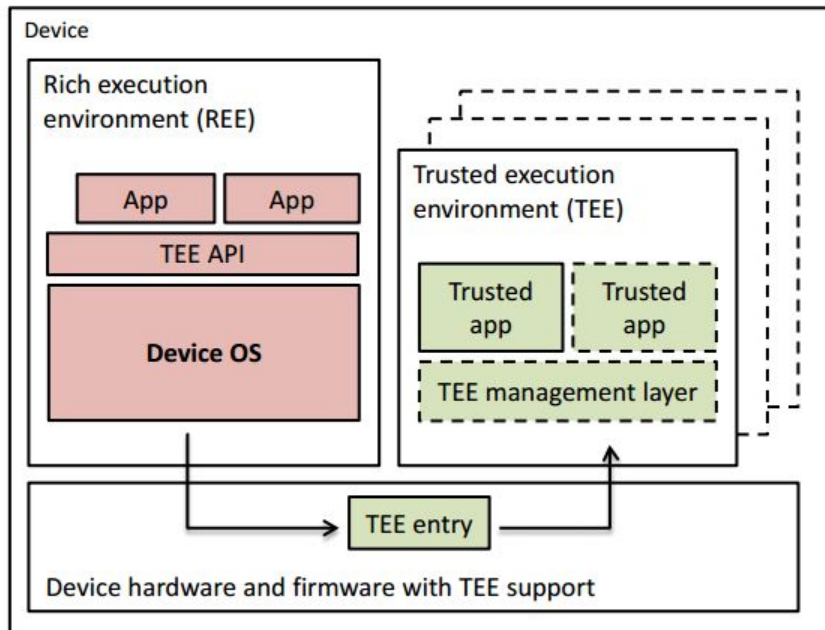
# TEE 하드웨어 아키텍처

## ❖ Processor secure environment

- ARM TrustZone and Intel SGX
- Countermeasure for
  - Virus and malwares
  - Low-budget hardware attack (e.g. Using a JTAG debugger)



# TEE System Architecture



## Architectures with single TEE

- ARM TrustZone
- TI M-Shield
- Smart card
- Crypto co-processor
- TPM

## Architectures with multiple TEEs

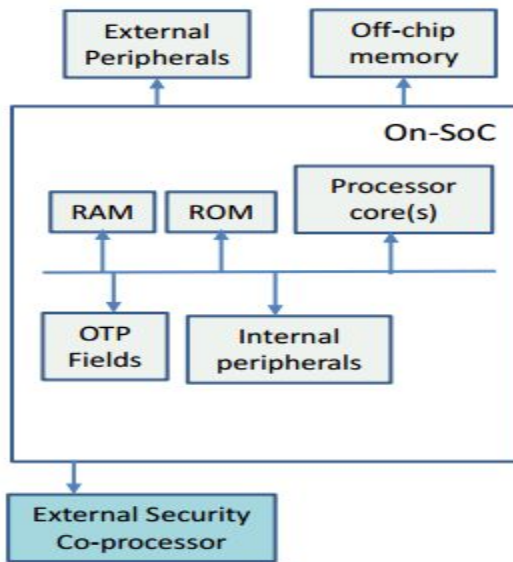
- Intel SGX
- TPM (and “Late Launch”)
- Hypervisor

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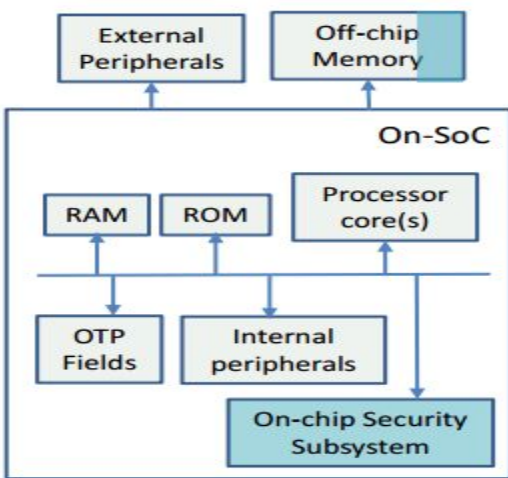
Figure adapted from: *Trusted Execution Environments on Mobile Devices*. ACM CCS 2013 tutorial.

# TEE Hardware Realizations

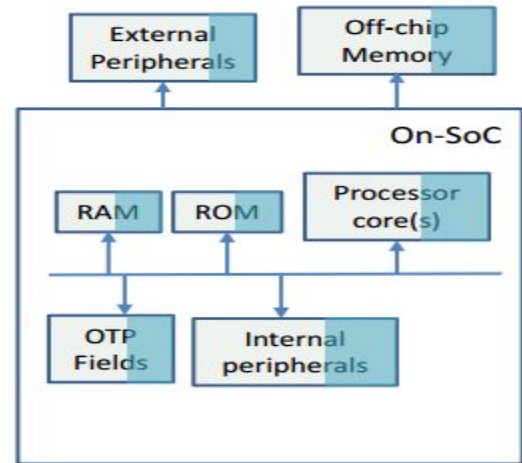
TEE component



External Secure Element  
(TPM, smart card)



Embedded Secure Element  
(smart card)



Processor Secure Environment  
(TrustZone, M-Shield)

Figure adapted from: Trusted Execution Environments on Mobile Devices. ACM CCS 2013 tutorial.

# Confidential Computing: AI Analytics on Private Data

## Healthcare data



Medical images

(e.g., X-rays, CT)



Medical history



Medication privacy

## Highly personal private data



SSN



GPS



Criminal records



## Collective learning



Privacy-preserving data analysis



AI/ML (machine learning)



Federated analytics

## Financial analytics



Expenses



Salary



Capital



# Confidential Computing: AI Analytics on Private Data

---

## Healthcare data



Medical  
images

(e.g., X-rays, CT)



Medical  
history



Medication  
privacy



# Privacy Issue in AI with Medical Data Processing

## Healthcare data



Medical images

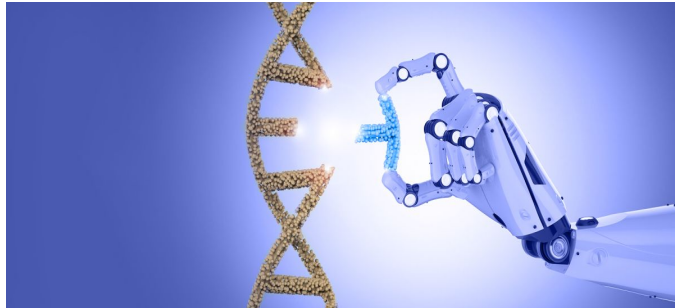
(e.g., X-rays, CT)



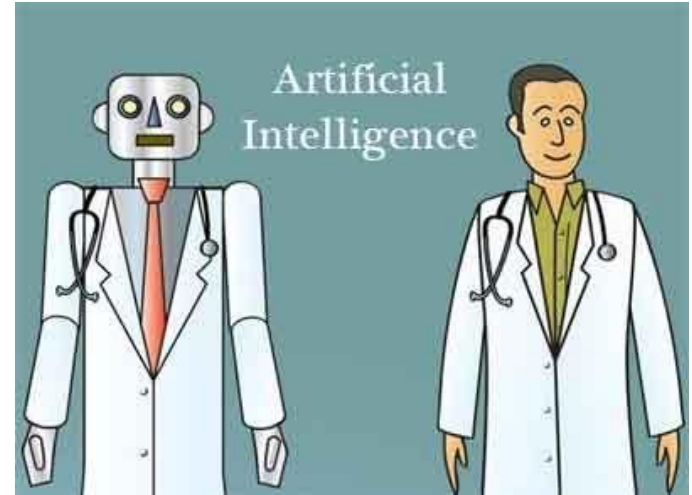
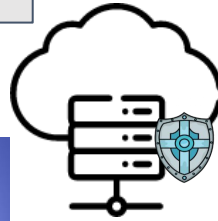
Medical history



Medication privacy

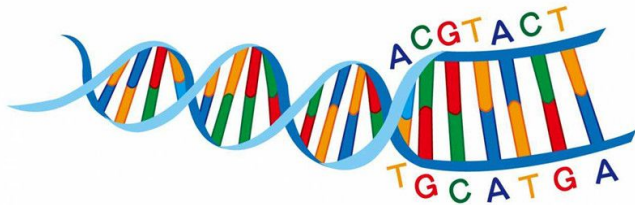


Gene editing backed by AI

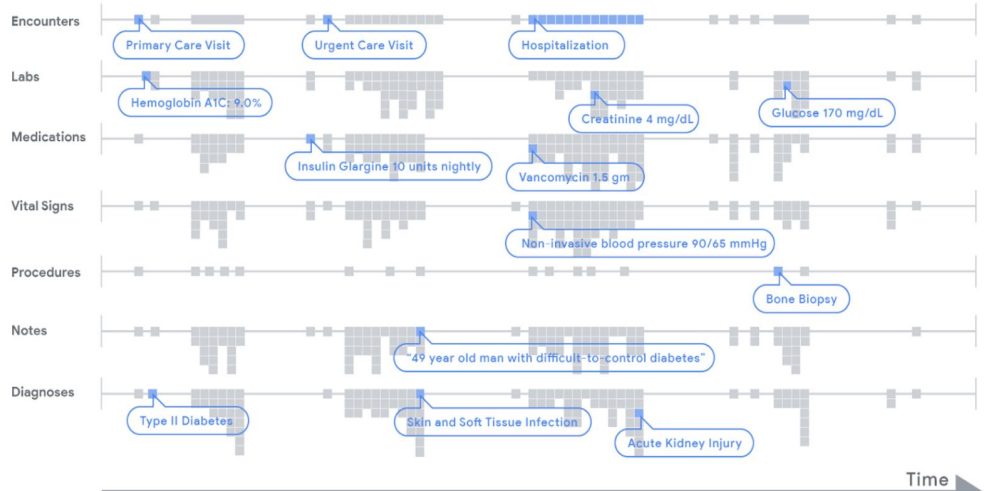


AI Doctor

# AI needs lots of Private Data for Machine Learning

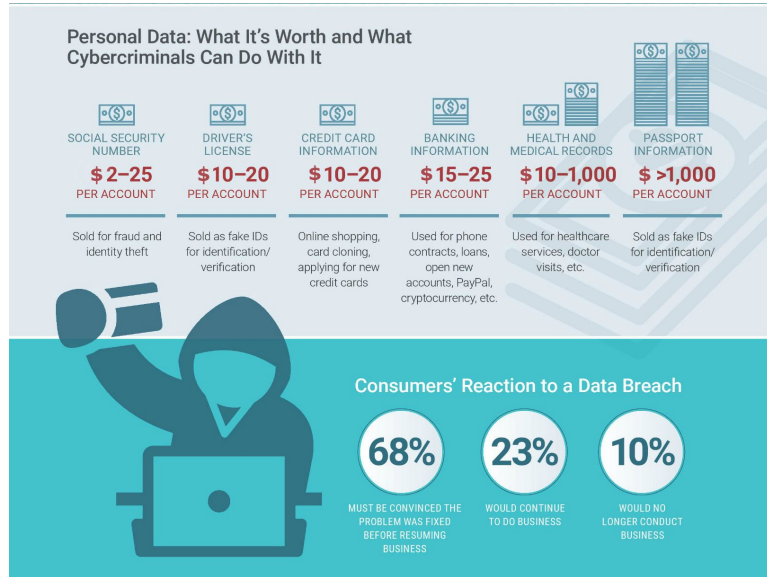


Patient Timeline



## Medical Information & DNA Genome

# Privacy Protection of Medical Data is Critical



## 655,000 Healthcare Records Being Sold on Dark Web

(출처: <https://threatpost.com/655000-healthcare-records-being-sold-on-dark-web/118933/>)

# Confidential Computing: AI Analytics on Private Data

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## Collective learning



Privacy-  
preserving  
data analysis



AI/ML  
(machine  
learning)



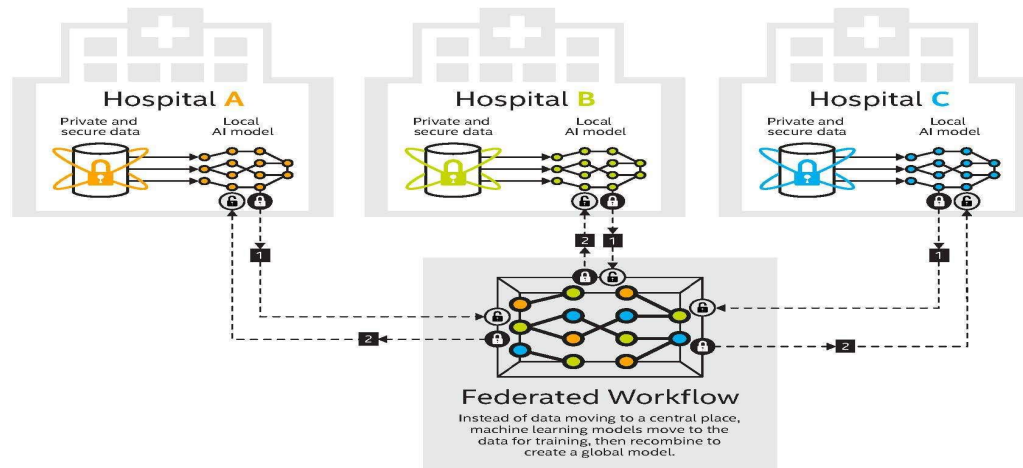
Federated  
analytics

# Federated Learning: Sharing Private Medical Data

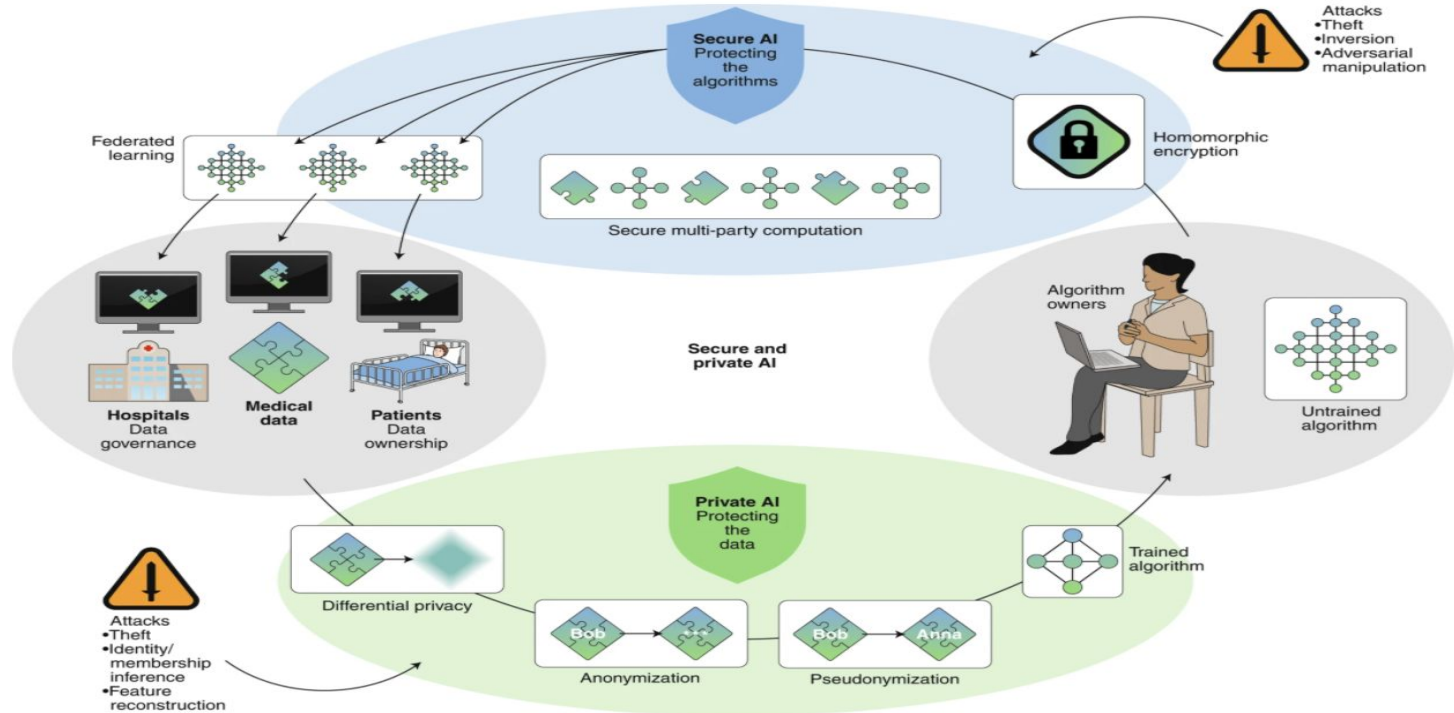
## Federated Learning Architecture

Federated learning is a distributed machine learning approach that enables organizations to collaborate on machine learning projects without sharing sensitive data such as patient records.

KEY: 1 Local model sharing 2 Global model sharing updates



# Secure and Private AI in Federated Machine Learning



Schematic overview of the relationships and interactions between data, algorithms, actors and techniques in the field of secure and private AI.

# Confidential Computing: AI Analytics on Private Data

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## Highly personal private data



SSN



GPS



Criminal  
records



# Self-Isolation Tracing App for Covid-19



# Self-Isolation Tracing App for Covid-19

## 4

### 자가격리자 정보·격리위치 등록

자가격리자 개인정보(자가격리 위치 등) 등록합니다.  
위치 이탈 시 자가격리자 앱과 전담공무원 앱에 **알림**이 갑니다.

The image displays two screenshots from the Self-Isolation Tracing App. The left screenshot shows the '자가격리자 등록' (Self-Isolation Registration) form. The right screenshot shows a map view with a notification box stating: '동행동행님이 격리장소에서 이탈하였습니다. 확인하여 주시기 바랍니다.' (Donghaengdonghaeng has left the quarantine location. Please check.) with a '확인' (Check) button.

# Contact Tracing Application for Android and IOS

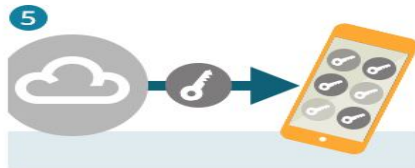
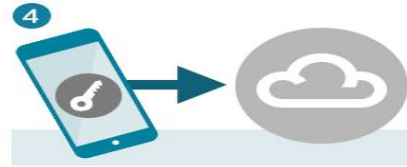
## What Apple and Google have proposed



When A and B meet, their phones exchange a key code



When A becomes infected, he updates his status in the app and gives his consent to share his key with the database



B's phone regularly downloads the database to check for matching codes. It alerts her that somebody she has been near has tested positive



# Contact Tracing Apps in the World


**App Store Preview**

**PUBLIC SERVICE ANNOUNCEMENT**  
**Exposure Notification Apps**


Download the app for the region or country in which you currently live. Additional apps will be added to this list as they become available. (iOS 13.5 or newer required.)

*An app may not be available in your area.*


**Austria**

-  **Stopp Corona**  
My contact diary [VIEW](#)


**Belgium**

-  **Coronalert - Belgium**  
Stay safe. Protect each other. [VIEW](#)

**Brazil**

-  **Coronavirus - SUS**  
Health & Fitness [VIEW](#)

**Canada**

-  **COVID Alert**  
Let's protect each other [VIEW](#)

# Confidential Computing: AI Analytics on Private Data

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## Financial analytics



Expenses



Salary



Capital

# 신뢰 컴퓨팅 (TEE) 적용 사례: AI 금융 보안

- 페이 열풍 시대

**PAYCO**

**SSGPAY.**

**kakaopay**



**SAMSUNG Pay**



**N Pay**

**Apple Pay**

**Financial analytics**



Expenses



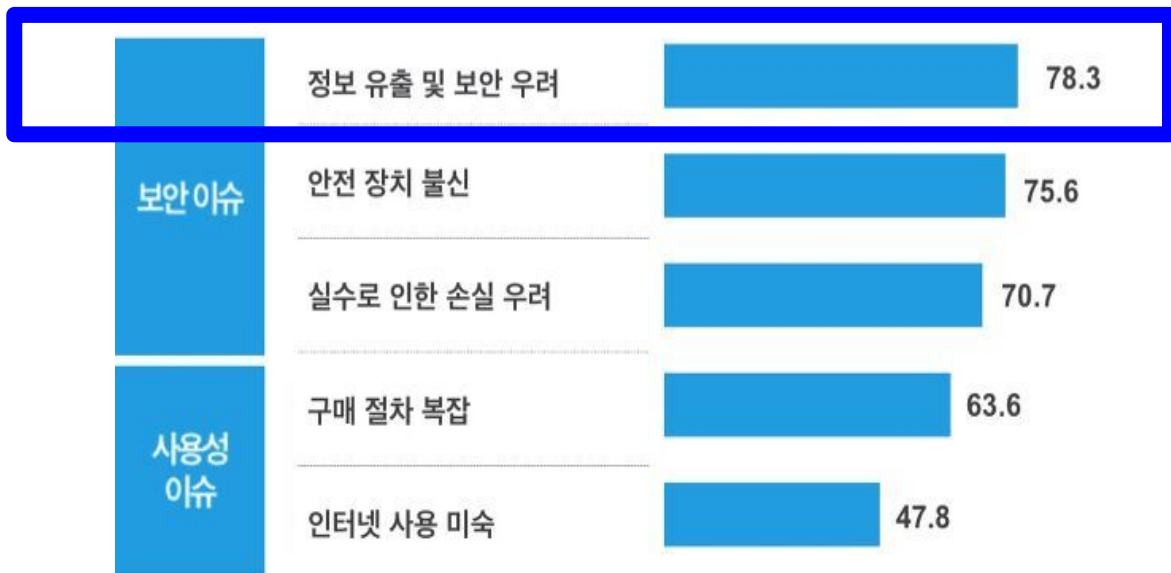
Salary



Capital

# AI 금융 보안

- 페이를 사용하지 않는 이유



Source : 한국은행 '15.01. 전국 2500 가구 대상 조사, 점수는 항목별 동의 정도에 대해 1~5점 부여 후 백분율로 환산

# 페이 보안

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- 안전한 디바이스(TEE) 기반의 페이

온라인 서버 기반의 페이

**PAYCO**

**SSGPAY.**

 kakaopay

 N Pay

디바이스(TEE) 기반의 페이



KNOX, TrustZone



Secure Enclave



# 신뢰 컴퓨팅 (TEE e.g., TrustZone)를 이용한 금융 보안



- 일반 실행 영역에서 동작하는 금융 앱



- 신뢰 컴퓨팅 실행환경에서 동작하는 금융 앱

# 신뢰 컴퓨팅 (TEE) 적용 사례: 전자키 보호의 필요성

Digital (Crypto) Keys are an essential part of our digital lives



은행 및 금융



데이터 베이스



DRM



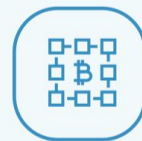
전자문서 서명



클라우드



IoT



블록체인



커넥티드 카(V2X)

- 데이터량 및 디바이스의 빠른 증가로 대용량의 암호키 생성 및 처리가 매우 중요해짐
- 클라우드 환경이 확대됨에 따라 클라우드 환경에서 이용이 편리하여야 함
- 물리적인 접근에 대한 방어보다는 SW 중심의 강력한 보안 기술이 더욱 절실해짐
- 새로운 암호 알고리즘을 적용하여 서비스 차별화 및 경쟁력 확보가 필요함

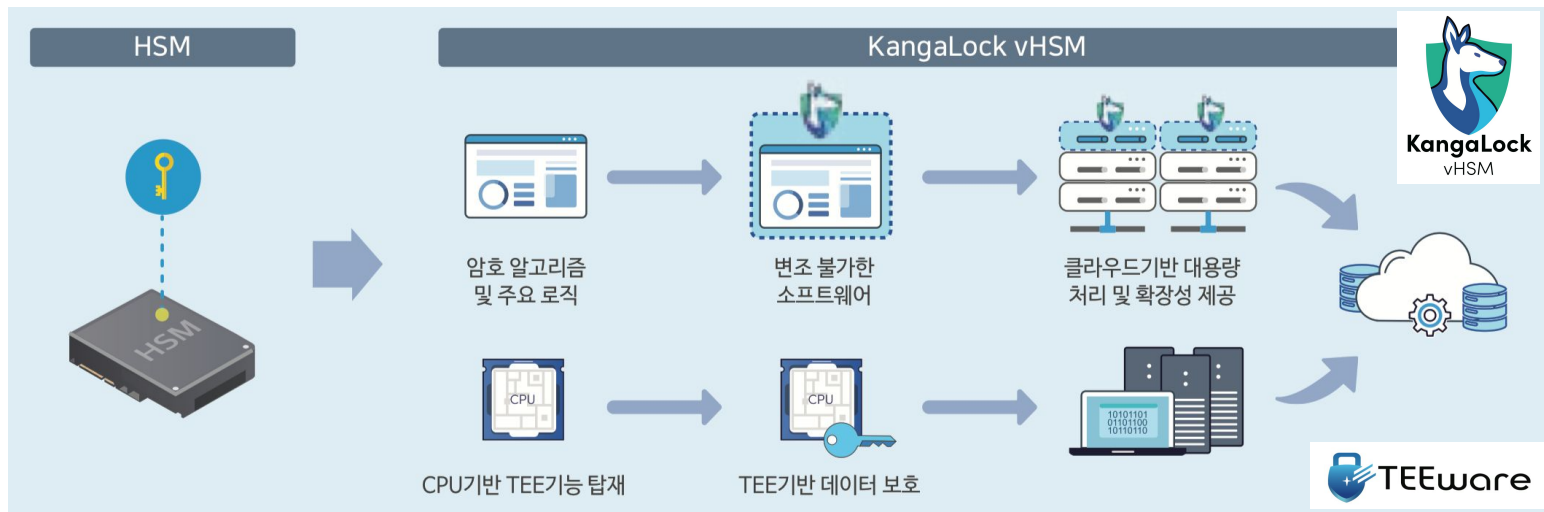


고도화된  
암호키 솔루션  
요구증대



# 신뢰 컴퓨팅 (TEE) 적용 사례: 전자키 보호 관리

## Scalable and Secure Digital Key Management with TEE



# Confidential Computing Consortium and TEE Companies

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출처: <https://confidentialcomputing.io/>



# Acknowledgements and Contacts: [cysec.kaist.ac.kr](http://cysec.kaist.ac.kr)

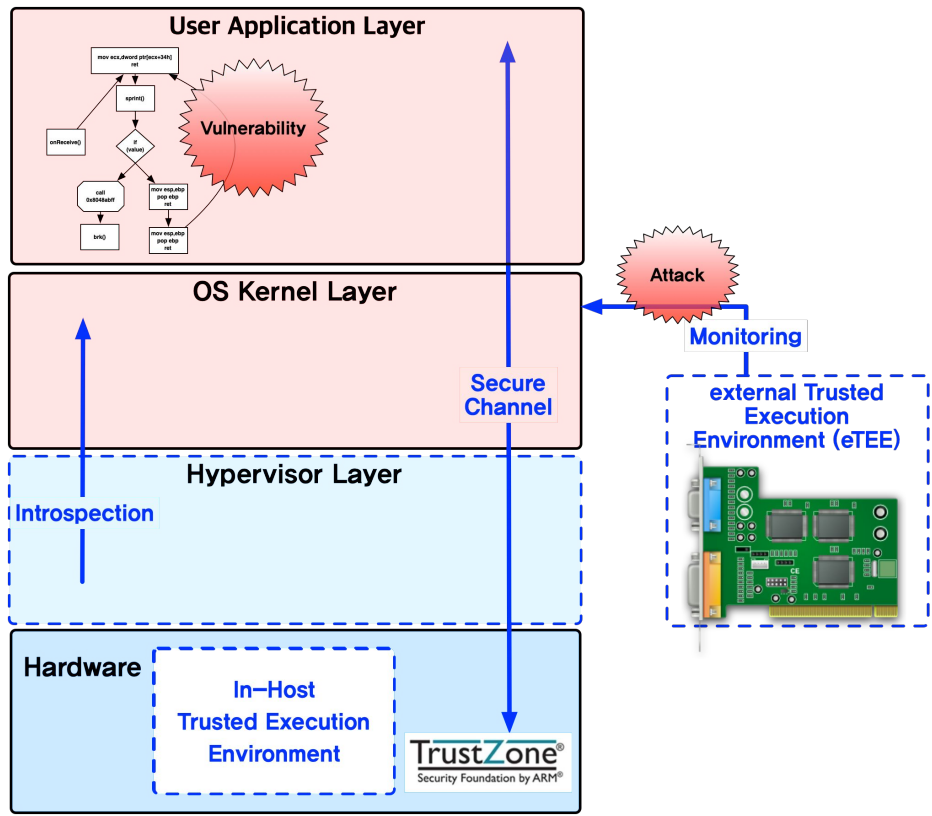
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<https://cysec.kaist.ac.kr/#publications>

- [\[PrivateZone\] J. Jang, C. Choi, J. Lee, N. Kwak, S. Lee, Y. Choi, B. Kang\\*, "PrivateZone: Providing a Private Execution Environment using ARM TrustZone", IEEE Transactions on Dependable and Secure Computing \(IEEE TDSC\)](#)
- [\[SECRET\] J. Jang, S. Kong, M. Kim, D. Kim and B. Kang. SeCReT: Secure Channel between Rich Execution Environment and Trusted Execution Environment . NDSS 2015](#)
- [\[HackingEnclave\] J. Lee, J. Jang, Y. Jang, N. Kwak, Y. Choi, C. Choi, T. Kim, M. Peinado, B. Kang\\*, "Hacking in Darkness: Return-oriented Programming against Secure Enclaves", USENIX Security 2017](#)
- [\[SystemOpenSGX\] C. Choi, N. Kwak, J. Jang, D. Jang, K. Oh, K. Kwag, B. Kang\\* "S-OpenSGX: A System-level Platform for Exploring SGX Enclave-Based Computing", Computer & Security, 2017](#)
- [\[ATRA\] D. Jang, H. Lee, M. Kim, D. H. Kim, D. G. Kim and B. Kang. ATRA: Address Translation Redirection Attack against Hardware-based Kernel Integrity Monitors. ACM CCS 2014.](#)
- [\[KIMON\] H. Lee, H. Moon, D. Jang, K. Kim, J. Lee, Y. Paek and B. Kang. KI-Mon: A Hardware-assisted Event-triggered Monitoring Platform for Mutable Kernel Object. USENIX Security 2013.](#)
- [\[VIGILARE\] H. Moon, H. Lee, J. Lee, K. Kim, Y. Paek and B. Kang. Vigilare: Toward Snoop-based Kernel Integrity Monitor. ACM CCS 2012. & Detecting Kernel Rootkit Attacks with Bus Snooping. IEEE Transactions on Dependable and Secure Computing](#)
- Kernel Integrity Monitors (Securing computing systems from the core: Kernel defense against insidious rootkit malware): [http://breakthroughs.kaist.ac.kr/?post\\_no=163](http://breakthroughs.kaist.ac.kr/?post_no=163)

*Icons made by [Freepik](#), [Smartline](#), [KiranShastri](#), [Bercis](#), [Smashicons](#), [Eucalyp](#), [prettycons](#) from [www.flaticon.com](http://www.flaticon.com)*

# Q & A



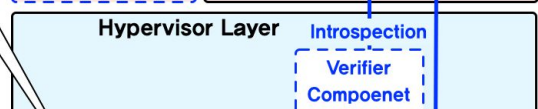
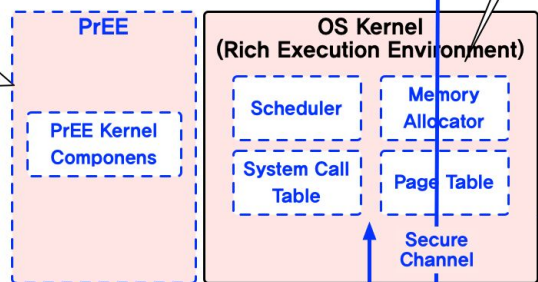
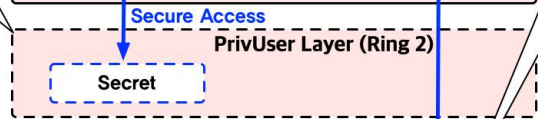
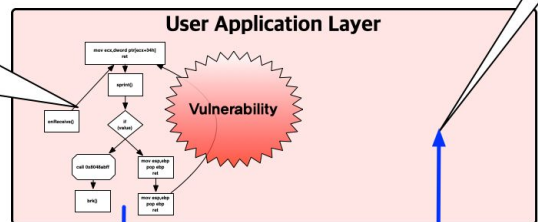
Detecting malicious binary or URL based on machine learning  
 FriSM (SecureComm)  
 Sungjin et. al (Com&Sec)  
 The Image Game (IEEE Access)

User mode privilege separation on x86  
 Lord of the x86 Rings (CCS '18)

Framework that enables individual developers to utilize TrustZone resources (Open version of TrustZone)  
 PrivateZone (IEEE TDSC)

Code reuse attack or controlled-channel attack against Intel Software Guard eXtensions (SGX)  
 Hacking in Darkness (Usenix Security '17)  
 SGX-LEGO (Com&Sec)

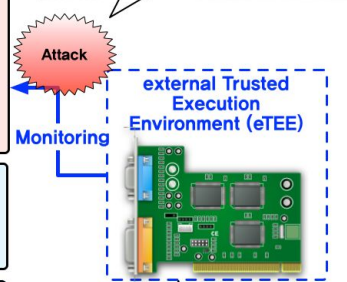
Open platform of Intel Software Guard eXtensions (SGX) allowing an app to run inside an isolated execution environment  
 OpenSGX (NDSS '16)  
 S-OpenSGX (Com&Sec)



Establishing secure channel between ARM TrustZone and security-sensitive applications  
 SeCRet (NDSS '15)

Hardening Low Fragmentation Heap (LFH) Allocator to prevent Use-After-Free attack  
 On the Analysis of Byte-Granularity Heap Randomization (Computers & Security)  
 Per-allocation Object Layout Randomization  
 POLaR (DSN '19)

Address Translation Redirection Attack (ATRA) circumventing external hardware monitors by relocating kernel objects into non-monitoring region  
 ATRA (CCS '14)



External Kernel Integrity Monitors monitoring kernel from secure independent external processor  
 Vigilare (CCS '12)  
 KI-Mon (Usenix Security '13)



