Functional Programming for Securing Cloud and Embedded Environments

Abhiroop Sarkar Chalmers University



"Securing Digital Systems through Programming Language Techniques"

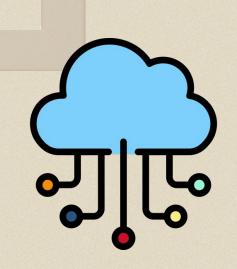


"Securing Digital Systems Programming Language Techniques"





My Research



Digital Systems

Cloud Computing

- Multi-Tenant
- Large Trust Boundary

My Research



Digital Systems

Embedded Systems

- Resource Constrained
- Reactive systems
- Time-bound systems



"Securing Digital Systems

Stuxnet computer worm





Microsoft Security Bulletin MS10-046 - Critical

Vulnerability in Windows Shell Could Allow Remote Code Execution (2286198)

Microsoft Security Bulletin MS10-061 - Critical

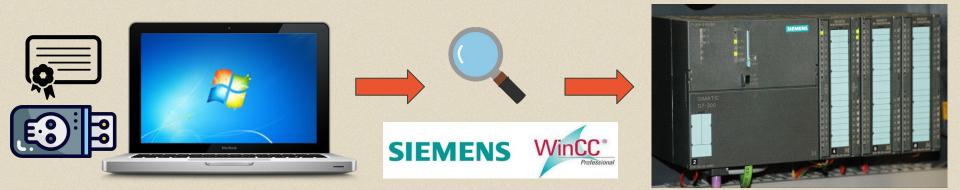
Vulnerability in Print Spooler Service Could Allow Remote Code Execution (2347290)



OS Remote Code Execution



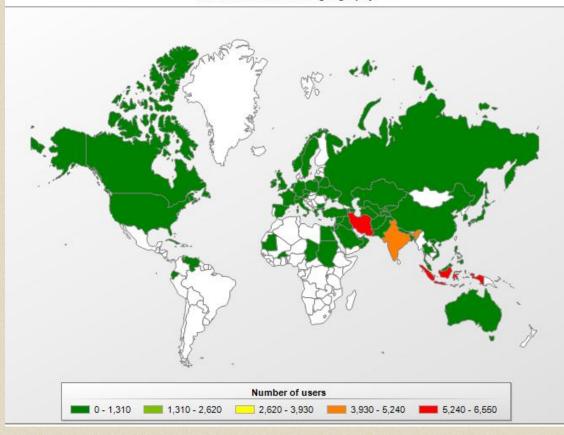
OS Remote Code Detect vulnerable PLC Execution Driver otherwise hide



OS Remote Code Detect vulnerable PLC Attack Siemens Execution Driver otherwise hide PLC 807 - 1210Hz

Stuxnet Impact

Rootkit.Win32.Stuxnet geography



Attacker Model 1



TRUST

in the OS and other low-level software

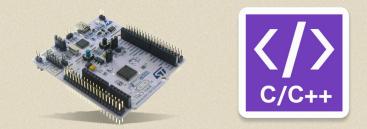
Attacker Model 1



TRUST

in the OS and other low-level software

Attacker Model 2



MEMORY UNSAFETY

to accommodate resource constraints

Attacker Model 1

Attacker Model 2





TRUST

in the OS and other low-level software

MEMORY UNSAFETY

to accommodate resource constraints



"Securing Digital Systems 11



"Securing Digital Systems through Programming Language Techniques"

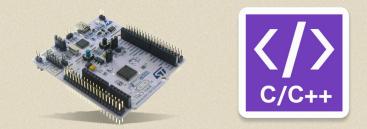
Attacker Model 1



TRUST

in the OS and other low-level software

Attacker Model 2



MEMORY UNSAFETY

to accommodate resource constraints

Contributions

Attacker Model 1



HasTEE⁺

for reducing **trust** on low-level software

Attacker Model 2



SynchronVM

for *memory-safe*, *soft real-time* embedded systems

Part I HasTEE⁺



HasTEE: Programming Trusted Execution Environments with Haskell

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Alejandro Russo Chalmers University Gothenburg, Sweden russo@chalmers.se

Abstract

Trusted Execution Environments (TEEs) are hardware enforced memory isolation units, emerging as a pivotal security solution for security-critical applications. TEEs, like Intel SGX and ARM TrustZone, allow the isolation of confidential code and data within an untrusted host environment, such as the cloud and IoT. Despite strong security guarantees, TEE adoption has been hindered by an awkward programming model. This model requires manual application partitioning and the use of error-prone, memory-unsafe, and potentially information-leaking low-level C/C++ libraries.

We address the above with *HasTEE*, a domain-specific language (DSL) embedded in Haskell for programming TEE applications. HasTEE includes a port of the GHC runtime for the Intel-SGX TEE. HasTEE uses Haskell's type system to automatically partition an application and to enforce *Information Flow Control* on confidential data. The DSL, being embedded in Haskell, allows for the usage of higher-order functions, monads, and a restricted set of I/O operations to write any standard Haskell application. Contrary to previous work, HasTEE is lightweight, simple, and is provided as a *simple security library*; thus avoiding any GHC modifications. We show the applicability of HasTEE by implementing case studies on federated learning, an encrypted password wallet, and a differentially-private data clean room. Robert Krook Chalmers University Gothenburg, Sweden krookr@chalmers.se

Koen Claessen Chalmers University Gothenburg, Sweden koen@chalmers.se

Keywords: Trusted Execution Environment, Haskell, Intel SGX, Enclave

ACM Reference Format:

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1 Introduction

Trusted Execution Environments (TEEs) are an emerging design of hardware-enforced memory isolation units that aid in the construction of security-sensitive applications [Mulligan et al. 2021; Schneider et al. 2022]. TEEs have been used to enforce a strong notion of *trust* in areas such as confidential (cloud-)computing [Baumann et al. 2015; Zegzhda et al. 2017], IoT [Lesjak et al. 2015] and Blockchain [Bao et al. 2020]. Intel and ARM each have their own TEE implementations known as Intel SGX [Intel 2015] and ARM TrustZone [ARM 2004], respectively. Principally, TEEs provide a *disjoint* region of code and data memory that allows for the physical isolation of a program's execution and state from the underlying operating system, hypervisor, and I/O peripherals. For

HasTEE⁺: Confidential Cloud Computing and Analytics with Haskell

Abhiroop Sarkar^[0000-0002-8991-9472] and Alejandro Russo^[0000-0002-4338-6316]

Chalmers University, Gothenburg, Sweden {sarkara,russo}@chalmers.se

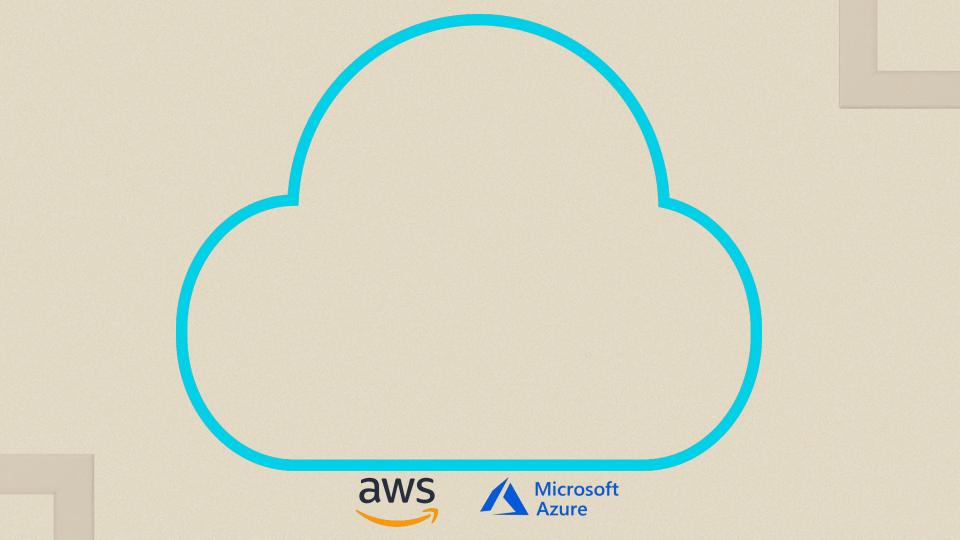
Abstract. Confidential computing is a security paradigm that enables the protection of confidential code and data in a co-tenanted cloud deployment using specialized hardware isolation units called Trusted Execution Environments (TEEs). By integrating TEEs with a Remote Attestation protocol, confidential computing allows a third party to establish the integrity of an *enclave* hosted within an untrusted cloud. However, TEE solutions, such as Intel SGX and ARM TrustZone, offer low-level C/C++-based toolchains that are susceptible to inherent memory safety vulnerabilities and lack language constructs to monitor explicit and implicit information-flow leaks. Moreover, the toolchains involve complex multi-project hierarchies and the deployment of hand-written attestation protocols for verifying *enclave* integrity.

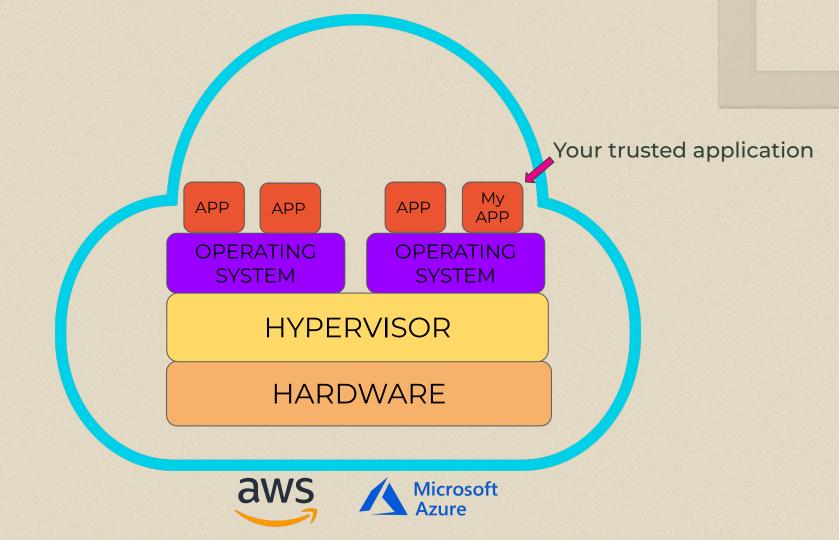
We address the above with HasTEE⁺, a domain-specific language (DSL) embedded in Haskell that enables programming TEEs in a high-level language with strong type-safety. HasTEE⁺ assists in multi-tier cloud application development by (1) introducing a *tierless* programming model for expressing distributed client-server interactions as a single program, (2) integrating a general remote-attestation architecture that removes the necessity to write application-specific cross-cutting attestation code, and (3) employing a dynamic information flow control mechanism to prevent explicit as well as implicit data leaks. We demonstrate the practicality of HasTEE⁺ through a case study on confidential data analytics, presenting a data-sharing pattern applicable to mutually distrustful participants and providing overall performance metrics.

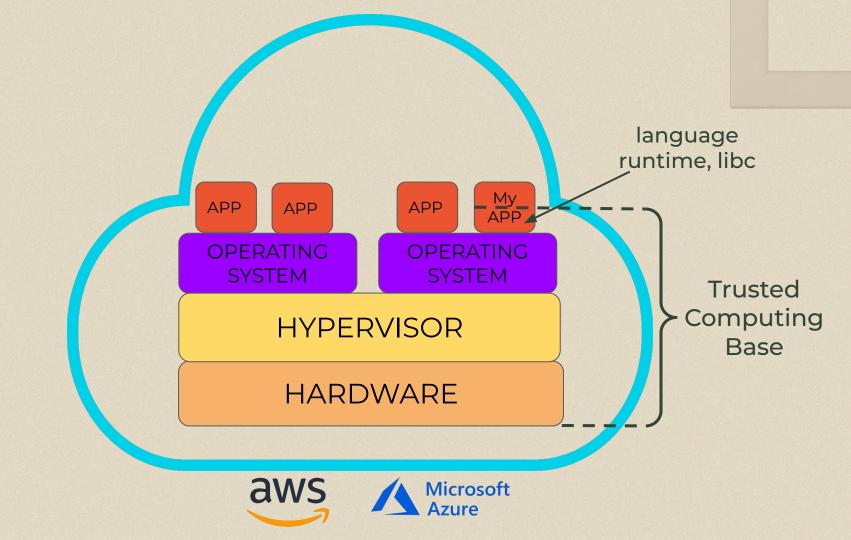
 $\label{eq:computing} \begin{array}{c} {\bf Keywords:} \ {\rm Confidential \ Computing} \cdot {\rm Trusted \ Computing} \cdot {\rm Trusted \ Execution \ Environments} \cdot {\rm Information \ Flow \ Control} \cdot {\rm Attestation} \cdot {\rm Haskell}. \end{array}$

Haskell Symposium 2023

Under Submission ESORICS 2024







Hypervisor/OS Vulnerabilities

{* VIRTUALIZATION *}

Hyper-V bug that could crash 'big portions of Azure cloud infrastructure': Code published

Now patched dereference 1 Tim Anderson Wed

Lurking in VULNERABILITIES

DAN GOODIN

Decade-Old VENOM Bug Exposes Virtualized Environments to Attacks

"Most serious" Linux privilege-escalation bug

ever is under active exploit (updated)

Security firm Cro NEWS

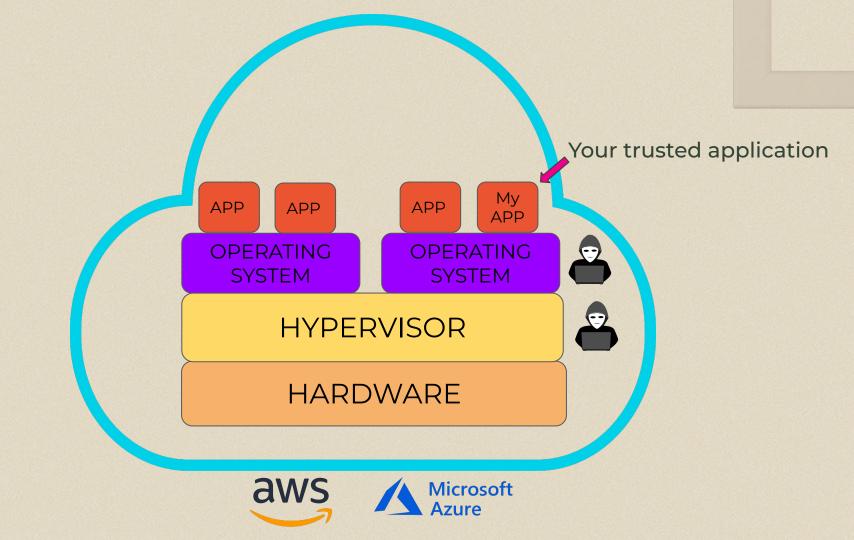
Critical Xen hypervisor flaw endangers virtualized environments

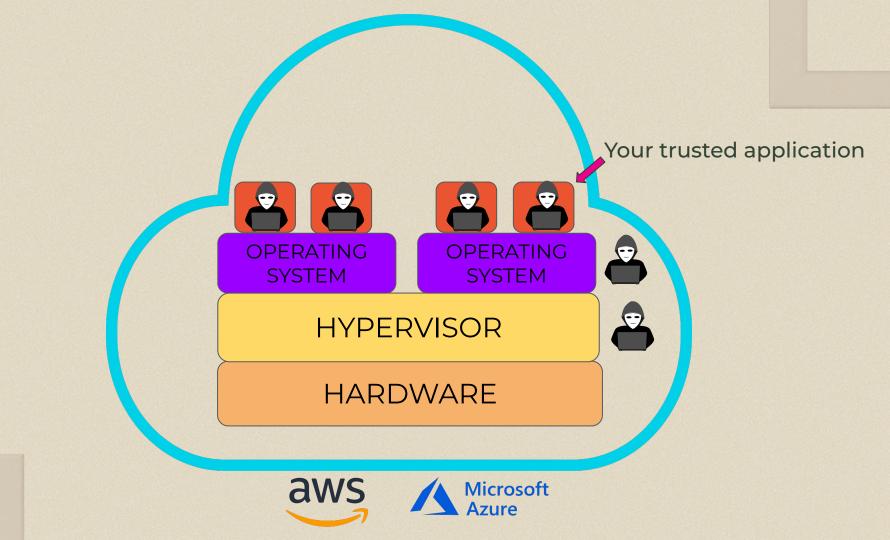
The vulnera NETWORK SECURI

Microsoft Ships Urgent Fixes for Critical Flaws in Windows Kerberos, Hyper-V

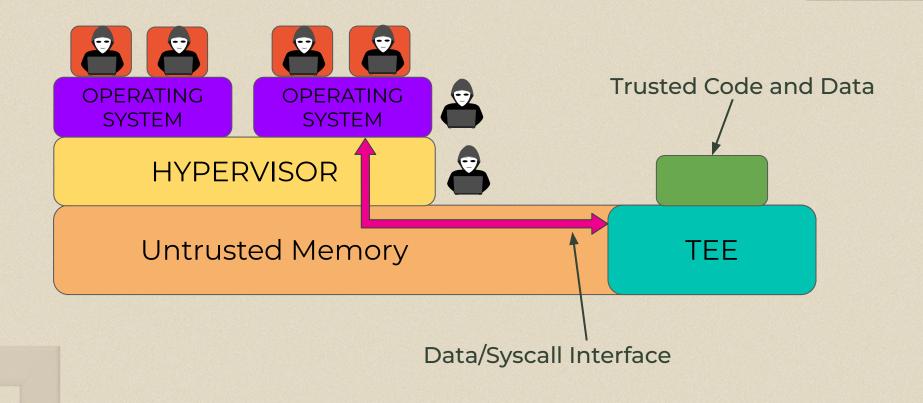
Patch 1 Home > News > Cloud

Hypervisor security flaw could expose AWS, Azure

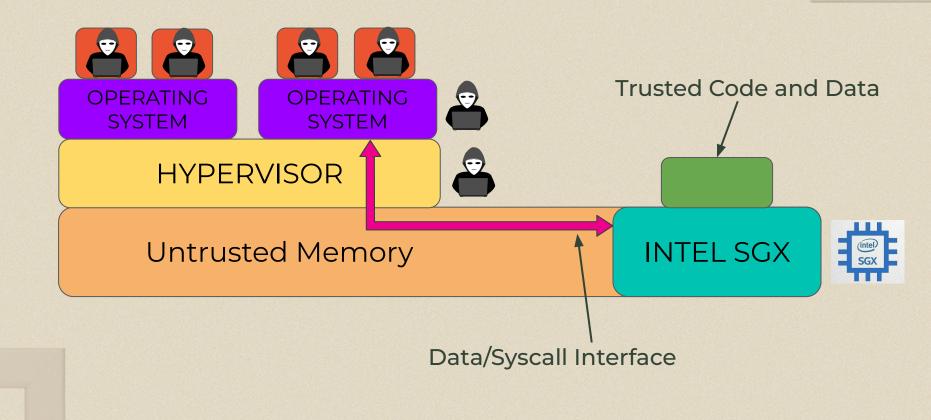




Trusted Execution Environments (TEE)



Trusted Execution Environments (TEE)

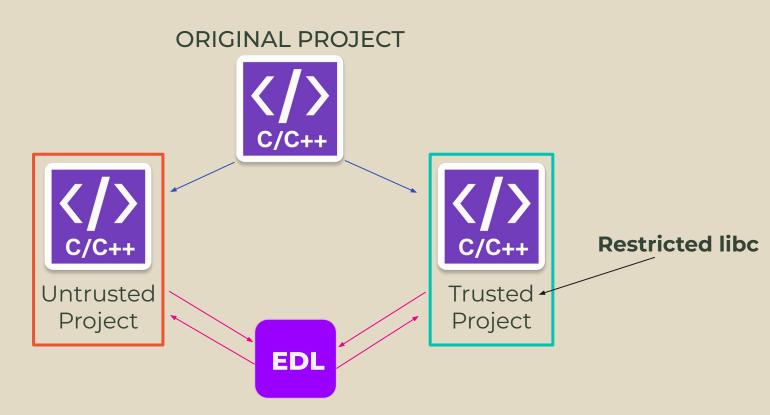


Programming TEEs

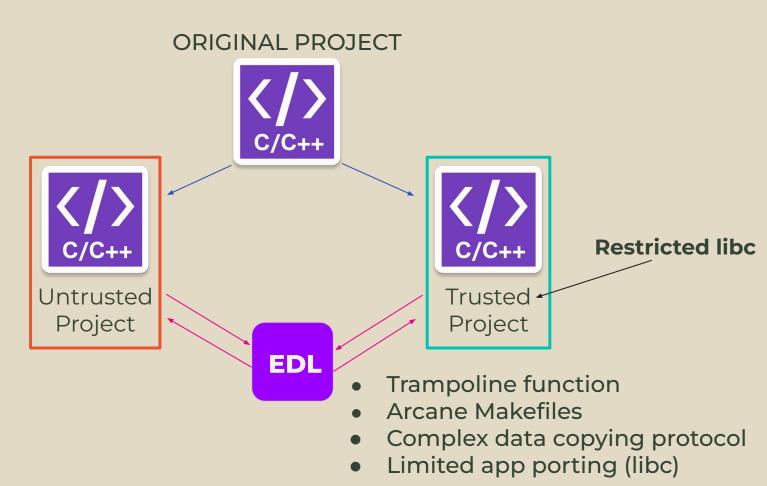
ORIGINAL PROJECT



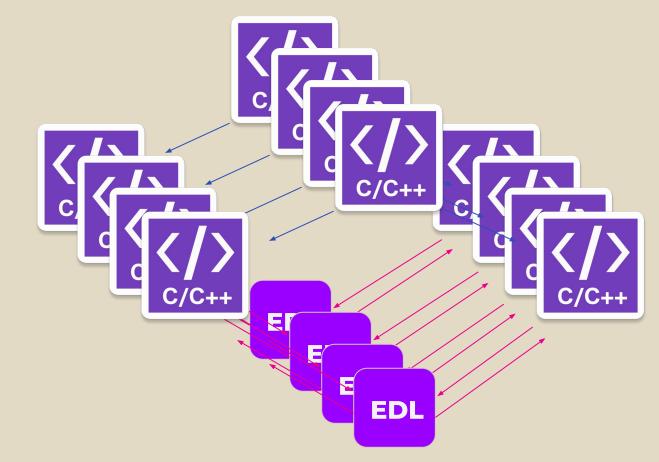
Programming TEEs



Programming TEEs



Distributed TEE Applications









TCS '02

Secure Program Partitioning

STEVE ZDANCEWIC, LANTIAN ZHENG, NATHANIEL NYSTROM, and ANDREW C. MYERS Cornell University

Language Support for Secure Software Development with Enclaves CSF '21

Aditya Oak TU Darmstadt Amir M. Ahmadian KTH Royal Institute of Technology Musard Balliu KTH Royal Institute of Technology

Guido Salvaneschi University of St.Gallen

PtrSplit: Supporting General Pointers in Automatic Program Partitioning CCS '17

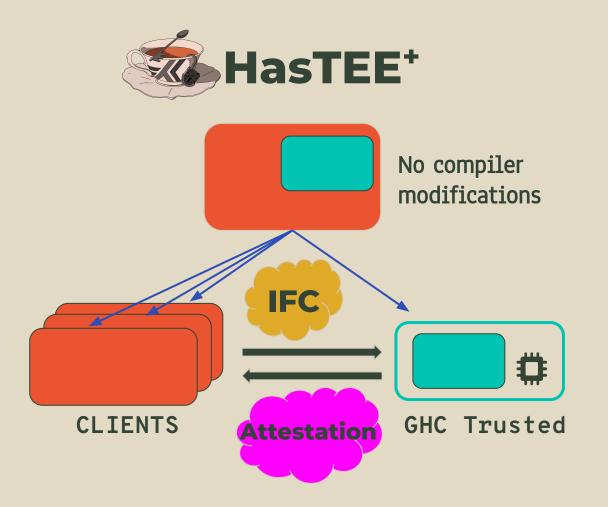
Shen Liu The Pennsylvania State University University Park, PA sxl463@cse.psu.edu Gang Tan The Pennsylvania State University University Park, PA gtan@ Trent Jaeger The Pennsylvania State University University Park, PA First, seamless integration of enclave programming into software applications remains challenging. For example, Intel provides a C/C++ interface to the SGX enclave but no direct support is available for managed languages. As managed languages like Java and Scala are extensively used for developing distributed applications, developers need to either interface their programs with the C++ code executing in the enclave (e.g., using the Java Native Interface [12]) or compile their enclave (e.g., using the Java Native Interface [12]) or compile

ATC '17

Glamdring: Automatic Application Partitioning for Intel SGX

Joshua Lind Christian Priebe Divya Muthukumaran Dan O'Keeffe Imperial College London Imperial College London Imperial College London Imperial College London Florian Kelbert **Tobias Reiher** David Goltzsche Pierre-Louis Aublin Imperial College London Imperial College London TU Dresden TU Braunschweig David Eyers Rüdiger Kapitza Christof Fetzer Peter Pietzuch University of Otago TU Braunschweig **TU** Dresden Imperial College London

- Significantly changes base language/compiler/runtime
- "Most interesting dynamic properties of programs are undecidable" (Rice's theorem)
- Either lack information flow control or runtime integration with TEEs or attestation support





return :: a → m a

(>>=) :: m a → (a → m b) → m b



(>>=) :: m a → (a → m b) → m b



(>>=) :: m a → (a → m b) → m b

TAINT TRACKING



return :: a → m a

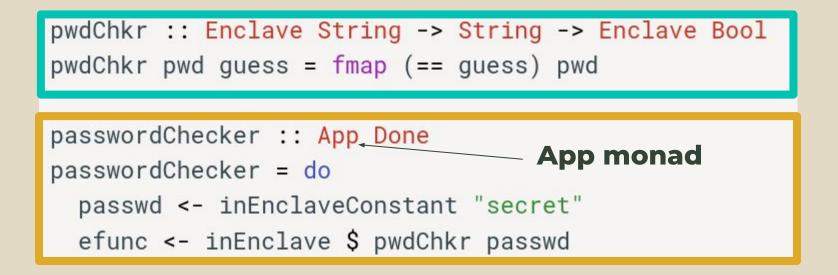
(>>=) :: m a → (a → m b) → m b

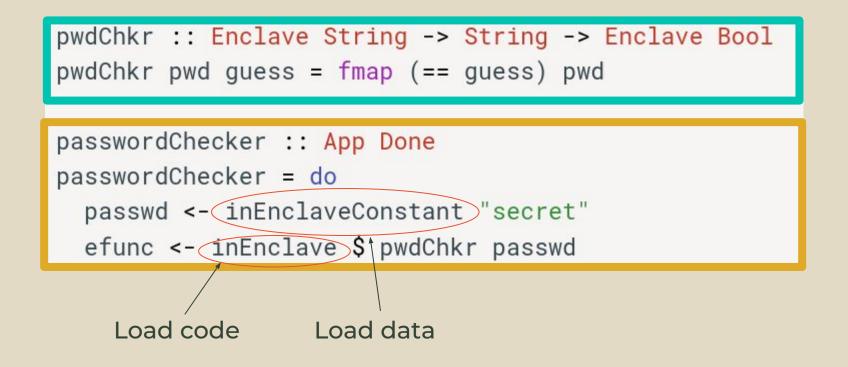
TAINT TRACKING **ALTERNATE SEMANTICS**

Illustration : Password Checker

pwdChkr :: Enclave String -> String -> Enclave Bool pwdChkr pwd guess = fmap (== guess) pwd

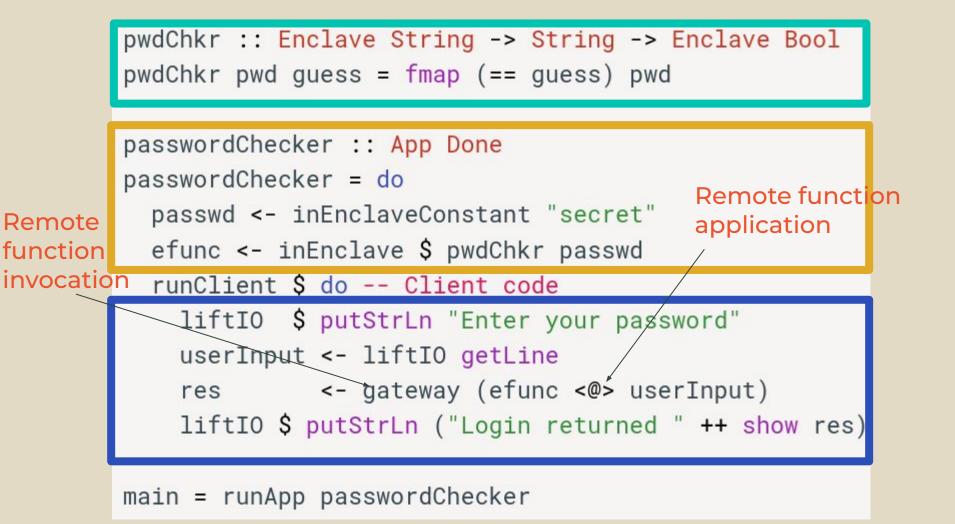
Enclave monad





```
pwdChkr :: Enclave String -> String -> Enclave Bool
pwdChkr pwd guess = fmap (== guess) pwd
passwordChecker :: App Done
passwordChecker = do
  passwd <- inEnclaveConstant "secret"</pre>
  efunc <- inEnclave $ pwdChkr passwd
  runClient $ do -- Client code
    liftIO $ putStrLn "Enter your password"
    userInput <- liftIO getLine
          <- gateway (efunc <@> userInput)
    res
    liftIO $ putStrLn ("Login returned " ++ show res)
```

main = runApp passwordChecker

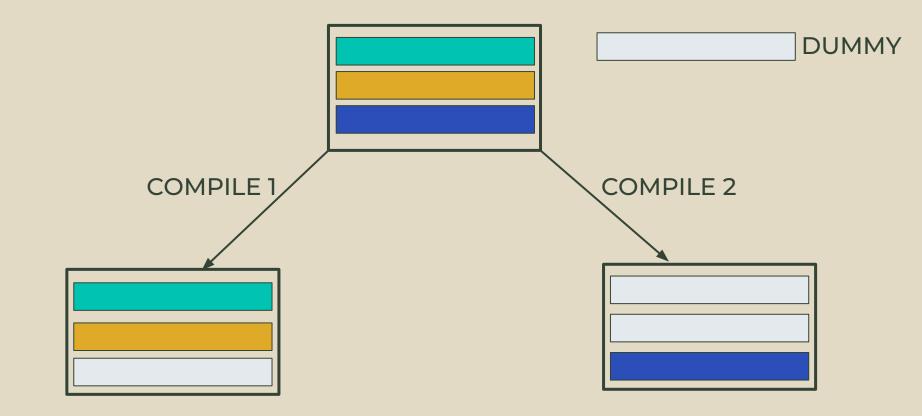


```
pwdChkr :: Enclave String -> String -> Enclave Bool
pwdChkr pwd guess = fmap (== guess) pwd
passwordChecker :: App Done
passwordChecker = do
  passwd <- inEnclaveConstant "secret"</pre>
  efunc <- inEnclave $ pwdChkr passwd
  runClient $ do -- Client code
    liftI0 $ putStrLn "Enter your password"
    userInput <- liftIO getLine
    res <- gateway (efunc <@> userInput)
    liftI0 $ putStrLn ("Login returned " ++ show res)
```

main = runApp passwordChecker



main = runApp passwordChecker



Ekblad A, Claessen K. A seamless, client-centric programming model for type safe web applications. Haskell Symposium 2014.

Compilation 1

Compilation 2

-- Enclave
pwdChkr :: Enclave String -> String -> Enclave Bool
pwdChkr pwd guess = fmap (== guess) pwd
passwordChecker :: App Done
passwordChecker = do
 passwd <- inEnclaveConstant "secret"
 efunc <- inEnclave \$ pwdChkr passwd
 return DONE DUMMY
-- wait for calls from Client
main = runApp passwordChecker</pre>



INTEL SGX

Compilation 1

Compilation 2

-- Enclave

pwdChkr :: Enclave String -> String -> Enclave Bool
pwdChkr pwd guess = fmap (== guess) pwd

```
passwordChecker :: App Done
passwordChecker = do
  passwd <- inEnclaveConstant "secret"
  efunc <- inEnclave $ pwdChkr passwd
  return DONE</pre>
```

```
-- wait for calls from Client
main = runApp passwordChecker
```

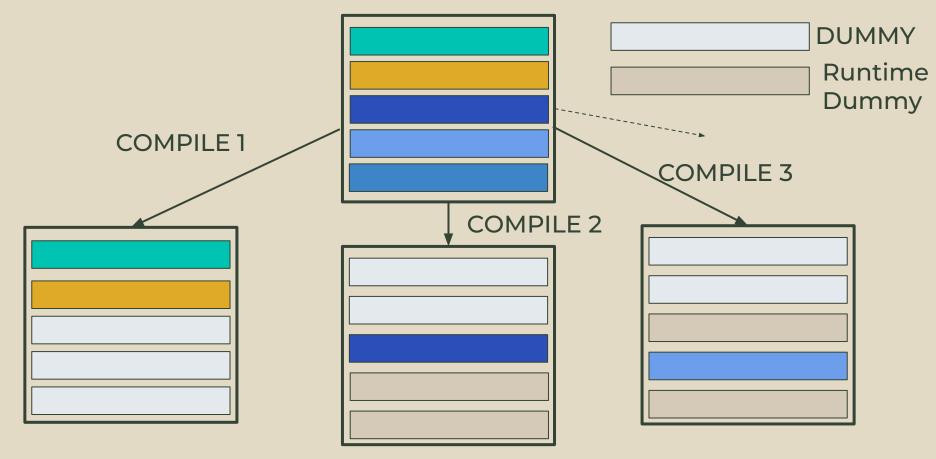


INTEL SGX

-- Client pwdChkr = -- gets optimised away passwordChecker :: App Done passwordChecker = do passwd <- return Dummy efunc <- inEnclave \$ -- ignores pwdChkr body runClient \$ do -- Client code liftIO \$ putStrLn "Enter your password" userInput <- liftIO getLine res <- gateway (efunc <@> userInput) liftIO \$ putStrLn ("Login returned " ++ show res)

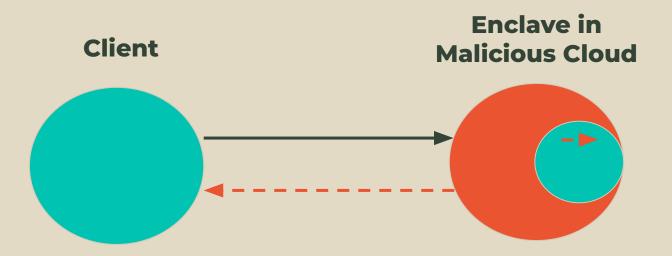
-- drives the application main = runApp passwordChecker

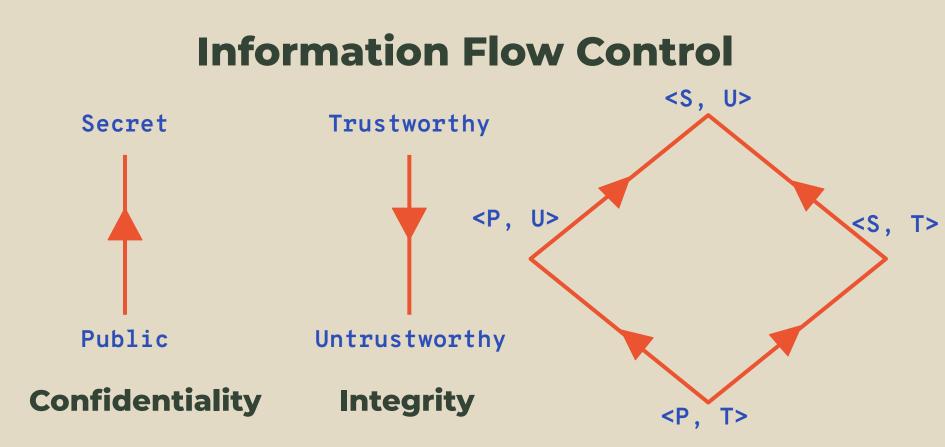
Generalisation for multiple clients



Shen G, Kashiwa S, Kuper L. Haschor: Functional Choreographic Programming for All. ICFP 2023

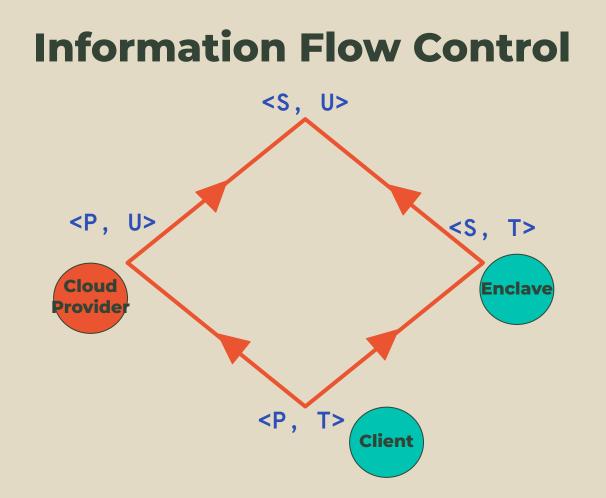
Information Flow

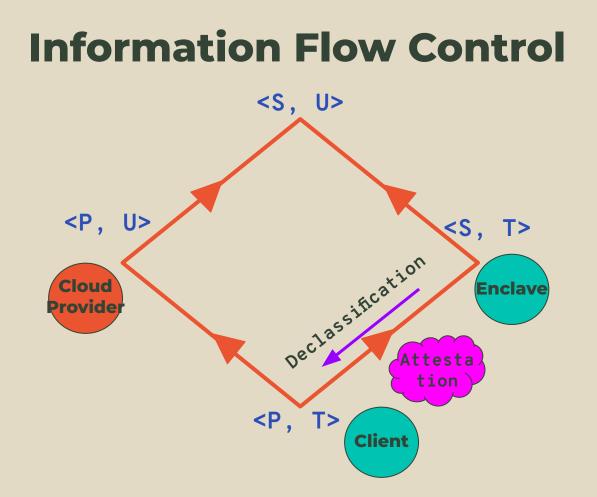


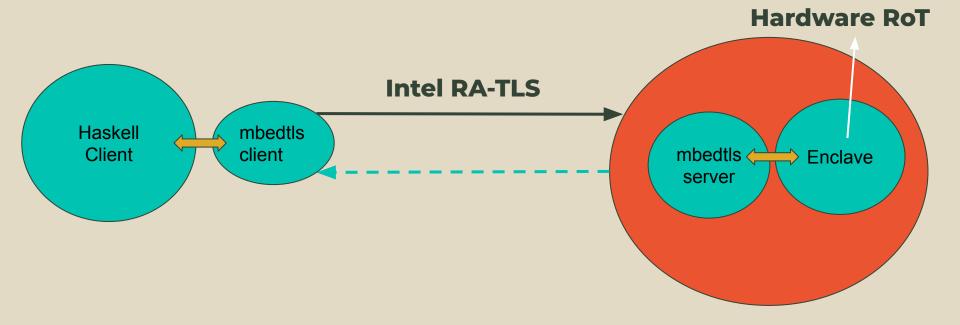


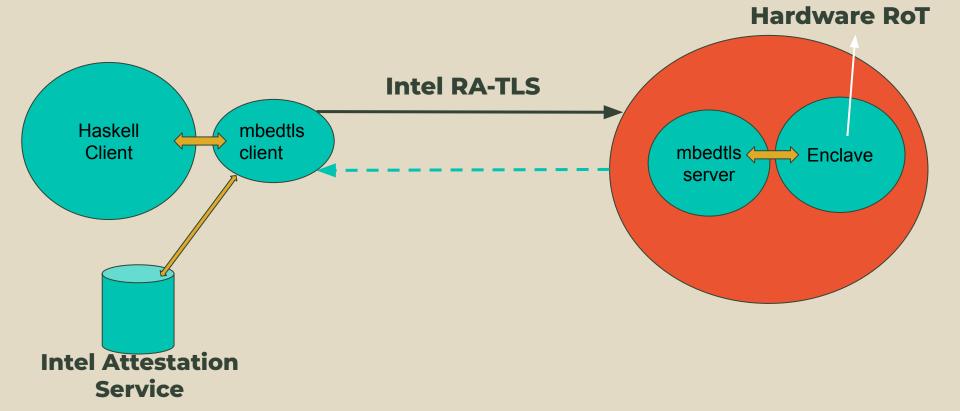
1. Denning, Dorothy E. "A lattice model of secure information flow." *Communications of the ACM* 19.5 (1976).

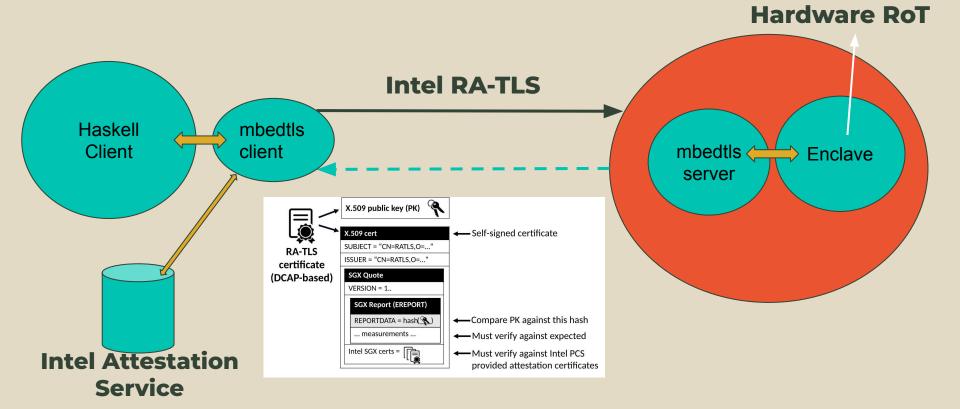
2. Biba, K.J. Integrity considerations for secure computer systems. Technical Report. April 1977.

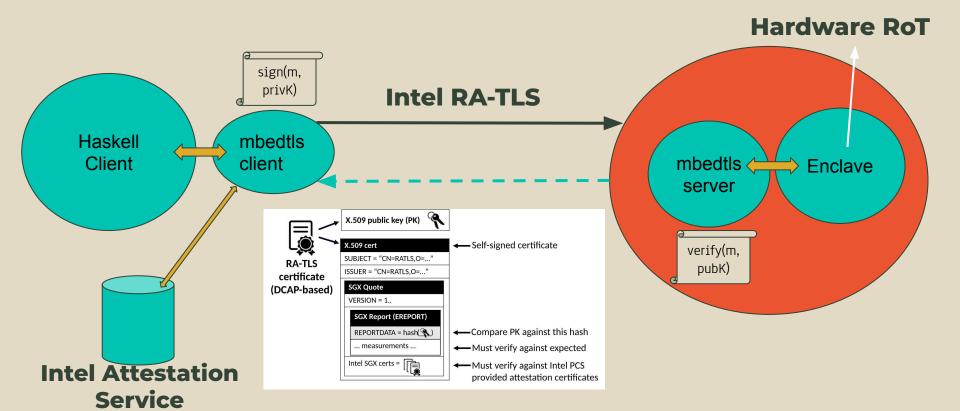




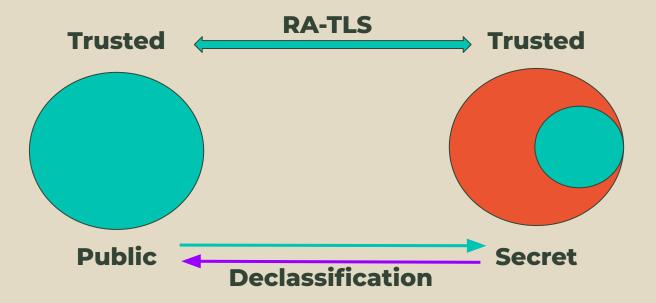








Information Flow

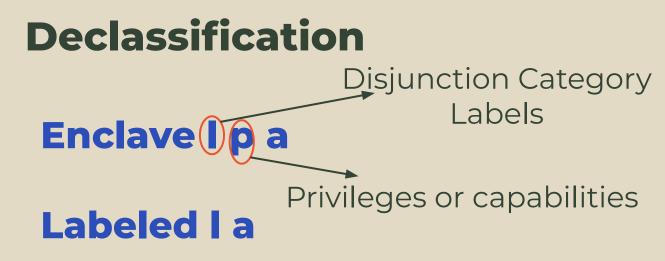


Declassification

Enclave I p a

Labeled I a

1. Stefan D, Russo A, Mitchell JC, Mazières D. Flexible Dynamic Information flow control in Haskell. Haskell Symposium 2011.



1. Stefan D, Russo A, Mitchell JC, Mazières D. Flexible Dynamic Information flow control in Haskell. Haskell Symposium 2011.

Declassification

Enclave I p a

Labeled I a



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Declassification

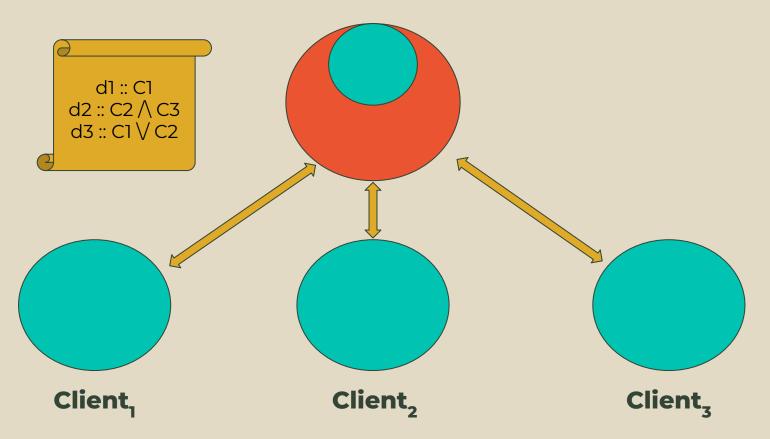
Enclave | p a

Labeled I a

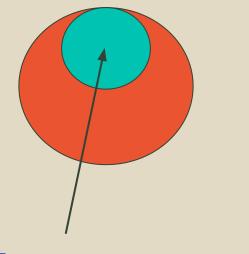


1. Stefan D, Russo A, Mitchell JC, Mazières D. Flexible Dynamic Information flow control in Haskell. Haskell Symposium 2011.

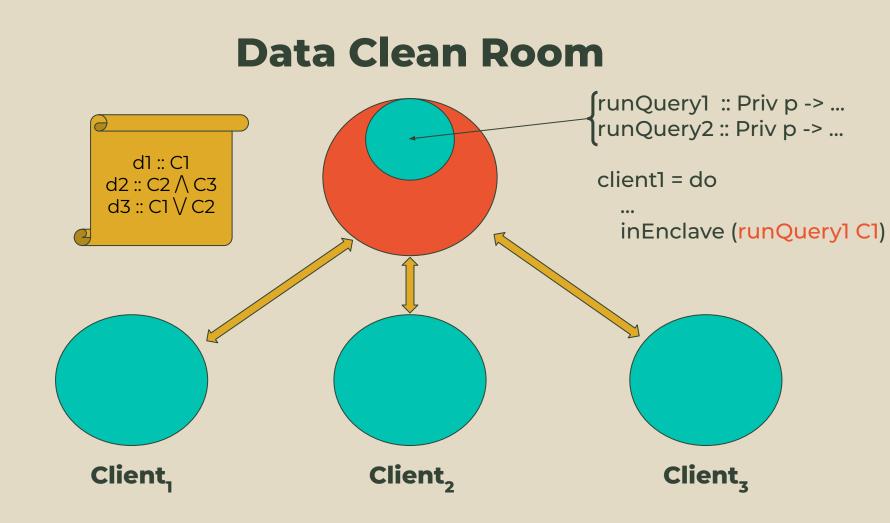
Data Clean Room

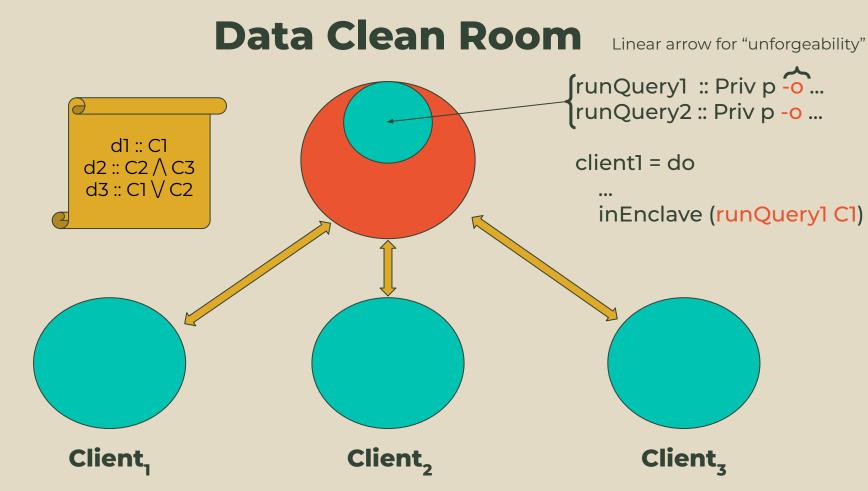


Data Clean Room

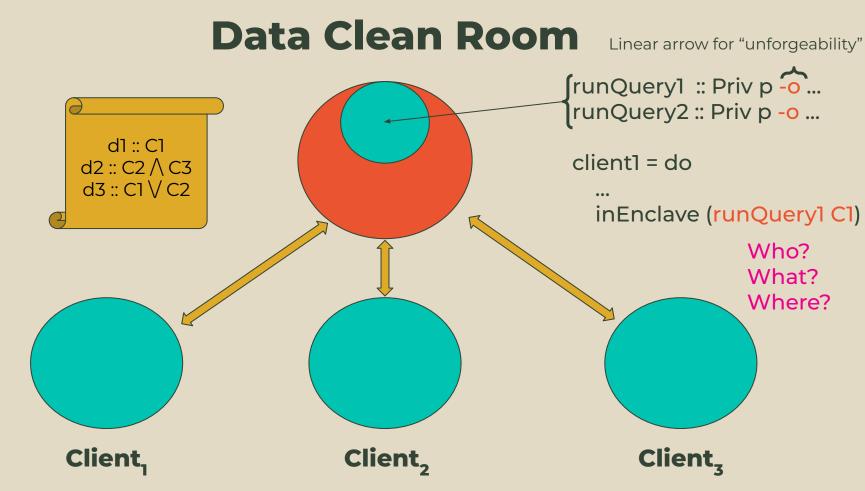


fl_{C1} :: ...Carries privilege to declassify C1 f2_{C2} :: ...



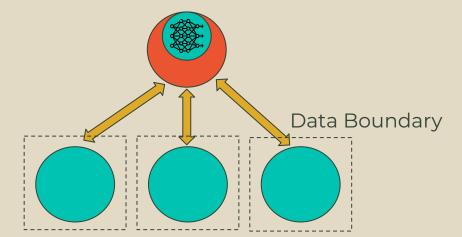


Linear Haskell: Practical Linearity in a Higher-Order Polymorphic Language. Bernardy et al. POPL 2017

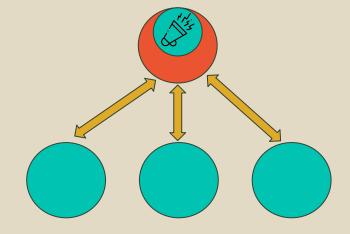


Declassification: Dimensions and Principles. Sabelfeld and Sands. Journal of Computer Security. 2009.

More case studies...

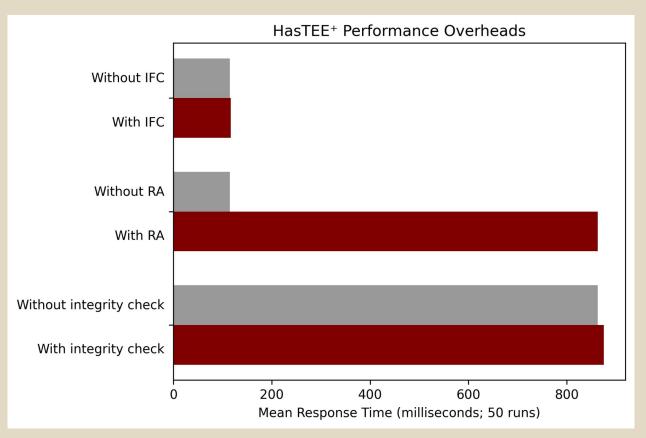


Federated Learning with TEEs and homomorphic encryption

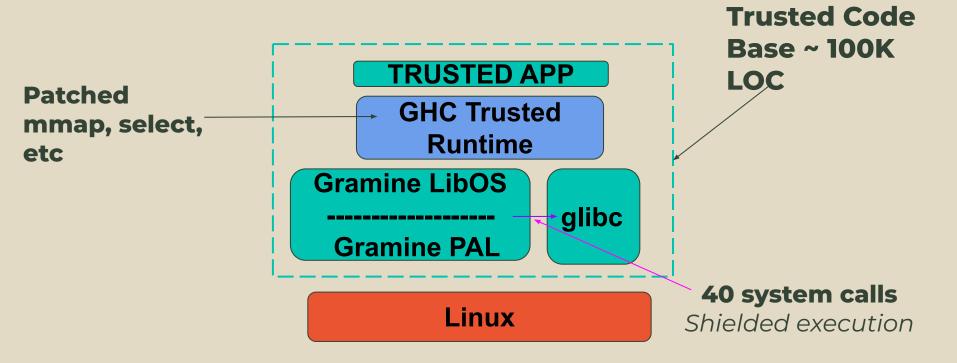


Data Clean Room with differential privacy

Performance Overheads



Trusted GHC



Tsai CC, Porter DE, Vij M. Graphene-SGX: A practical library {OS} for unmodified applications on {SGX}. Usenix ATC 2017.

Trusted GHC

Memory	RSS	Virtual Size	Disk Swap
At rest	19,132 KB	287,920 KB	0 KB
Peak	20,796 KB	290,032KB	0 KB

LATENCY ~ 60 ms vs 0.6 ms in native SDK



Part II SynchronVM

ATTACKER MODELS

Attacker Model 1



TRUST

in the OS and other low-level software

Attacker Model 2



MEMORY UNSAFETY

to accommodate resource constraints

Synchron - An API and Runtime for Embedded Systems

Abhiroop Sarkar 🖂 💿

Chalmers University, Sweden

Bo Joel Svensson ⊠[©] Chalmers University, Sweden

- Abstract

Programming embedded systems applications involves writing concurrent, event-driven and timing-aware programs. Traditionally, such programs are written in low-level machine-oriented programming languages like C or Assembly. We present an alternative by introducing Synchron, an API that offers high-level abstractions to the programmer while supporting the low-level infrastructure in an associated runtime system and one-time-effort drivers.

Embedded systems applications exhibit the general characteristics of being (i) concurrent, (ii) I/O-bound and (iii) timing-aware. To address each of these concerns, the Synchron API consists of three components - (1) a Concurrent ML (CML) inspired message-passing concurrency model, (2) a message-passing-based I/O interface that translates between low-level interrupt based and memory-mapped peripherals, and (3) a timing operator, syncT, that marries CML's sync operator with timing windows inspired from the TinyTimber kernel.

We implement the Synchron API as the bytecode instructions of a virtual machine called SynchronVM. SynchronVM hosts a Caml-inspired functional language as its frontend language, and the backend of the VM supports the STM32F4 and NRF52 microcontrollers, with RAM in the order of hundreds of kilobytes. We illustrate the expressiveness of the Synchron API by showing examples of expressing state machines commonly found in embedded systems. The timing functionality is demonstrated through a music programming exercise. Finally, we provide benchmarks on the response time, jitter rates, memory, and power usage of the SynchronVM.

2012 ACM Subject Classification Computer systems organization \rightarrow Embedded software; Software and its engineering \rightarrow Runtime environments; Computer systems organization \rightarrow Real-time languages; Software and its engineering \rightarrow Concurrent programming languages

Hailstorm : A Statically-Typed, Purely Functional Language for IoT Applications

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ABSTRACT

With the growing ubiquity of Internet of Things (IoT), more complex logic is being programmed on resource-constrained IoT devices, almost exclusively using the C programming language. While C provides low-level control over memory, it lacks a number of highlevel programming abstractions such as higher-order functions, polymorphism, strong static typing, memory safety, and automatic memory management.

We present Hailstorm, a statically-typed, purely functional programming language that attempts to address the above problem. It is a high-level programming language with a strict typing discipline. It supports features like higher-order functions, tail-recursion. and automatic memory management, to program IoT devices in a declarative manner. Applications running on these devices tend to be heavily dominated by I/O. Hailstorm tracks side effects like I/O in its type system using resource types. This choice allowed us to explore the design of a purely functional standalone language, in an area where it is more common to embed a functional core in an imperative shell. The language borrows the combinators of arrowized FRP, but has discrete-time semantics. The design of the full set of combinators is work in progress, driven by examples. So far, we have evaluated Hailstorm by writing standard examples from the literature (earthquake detection, a railway crossing system and various other clocked systems), and also running examples on the GRiSP embedded systems board, through generation of Erlang.

CCS CONCEPTS

Software and its engineering → Compilers; Domain specific languages; • Computer systems organization → Sensors and actuators; Embedded software.

Mary Sheeran mary.sheeran@chalmers.se Chalmers University Gothenburg, Sweden

September 8–10, 2020, Bologna, Italy. ACM, New York, NY, USA, 16 pages. https://doi.org/10.1145/3414080.3414092

1 INTRODUCTION

As the density of IoT devices and diversity in IoT applications continue to increase, both industry and academia are moving towards decentralized system architectures like *edge computing* [38]. In edge computation, devices such as sensors and client applications are provided greater computational power, rather than pushing the data to a backend cloud service for computation. This results in improved response time and saves network bandwidth and energy consumption [50]. In a growing number of applications such as aeronautics and automated vehicles, the real-time computation is more robust and responsive if the edge devices are compute capable.

In a more traditional centralized architecture, the sensors and actuators have little logic in them; they rather act as data relaying services. In such cases, the firmware on the devices is relatively simple and programmed almost exclusively using the C programming language. However with the growing popularity of edge computation, more complex logic is moving to the edge IoT devices. In such circumstances, programs written using C tend to be verbose, errorprone and unsafe [17, 27]. Additionally, IoT applications written in low-level languages are highly prone to security vulnerabilities [7, 58].

Hailstorm is a domain-specific language that attempts to address these issues by bringing ideas and abstractions from the functional and reactive programming communities to programming IoT applications. Hailstorm is a *pure*, *statically-typed* functional programming language. Unlike *impure* functional languages like ML and Scheme, Hailstorm restricts arbitrary side-effects and

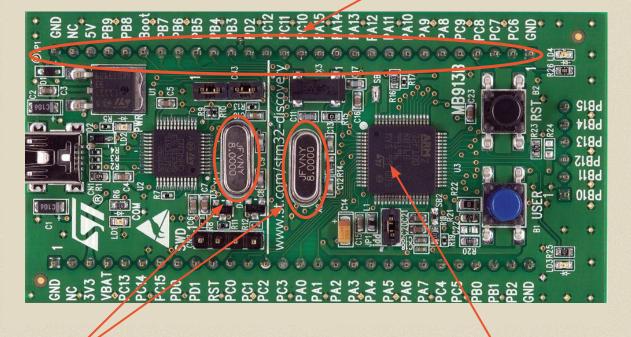
ECOOP 2022

PPDP 2020

I/O-Bound

192 KB RAM 168 MHz clock

Clocked



Bare-metal concurrent

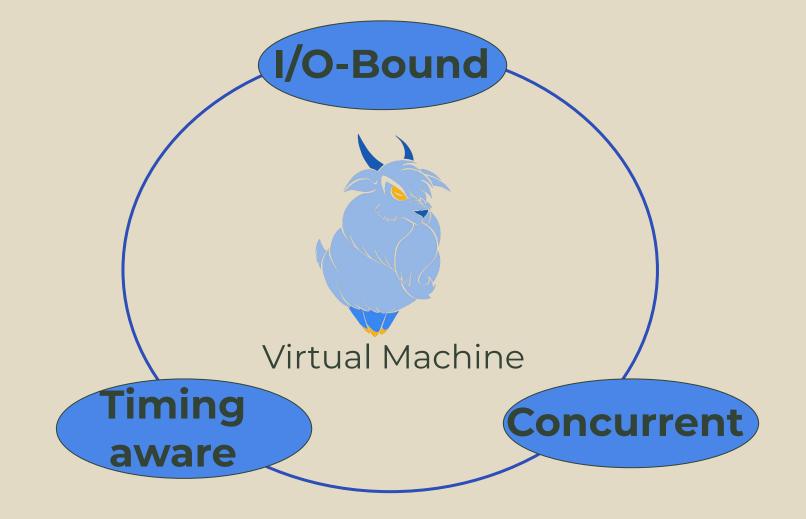
Programming Microcontrollers

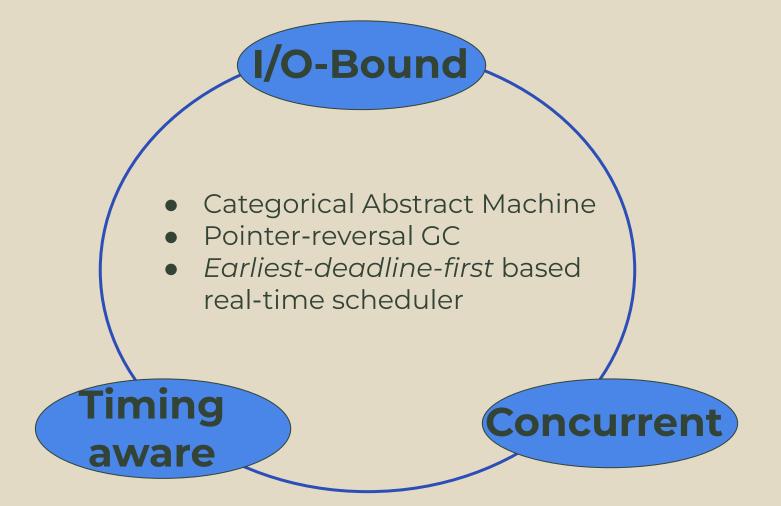
Memory Unsafe



no real-time constructs

!Concurrent





Cousineau G, Curien PL, Mauny M. The Categorical Abstract Machine. Science of computer programming. 1987

Complete Synchron API

spawn	: (() -> ()) -> ThreadId
channel	: () -> Channel a
send	: Channel a -> a -> Event ()
recv	: Channel a -> Event a
choose	: Event a -> Event a -> Event a
wrap	: Event a -> (a -> b) -> Event b
sync	: Event a -> a
syncT	: Time -> Time -> Event a -> a
spawnExt	ernal : Channel a -> Driver -> ExternalThreadId

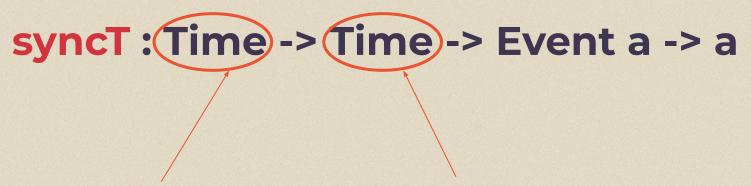
CML: A Higher-order Concurrent Language. John Reppy. PLDI 1991.

Complete Synchron API

spawn	: (() -> ()) -> ThreadId
channel	: () -> Channel a
send	: Channel a -> a -> Event ()
recv	: Channel a -> Event a
choose	: Event a -> Event a -> Event a
wrap	: Event a -> (a -> b) -> Event b
sync	: Event a -> a
syncT	: Time -> Time -> Event a -> a
<pre>spawnExternal : Channel a -> Driver -> ExternalThreadId</pre>	

CML: A Higher-order Concurrent Language. John Reppy. PLDI 1991.

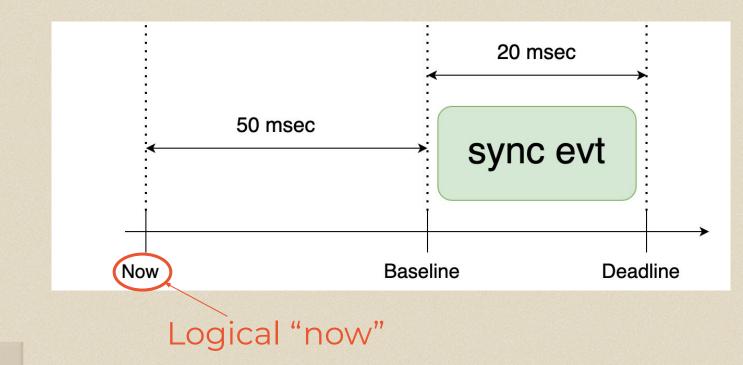
Timed Synchronisation



Relative Baseline

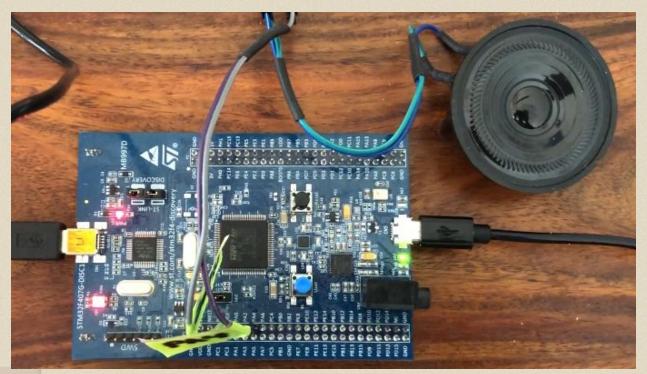
Relative Deadline

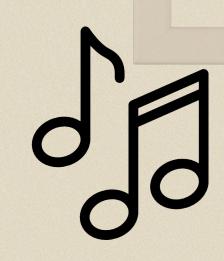
syncT (msec 50) (msec 20) evt



- 1. Berry G. The Foundations of Esterel. MIT Press 2000.
- 2. Nordlander J et al. Timber: A programming Language for Real-Time Embedded Systems. Technical Report 2002.

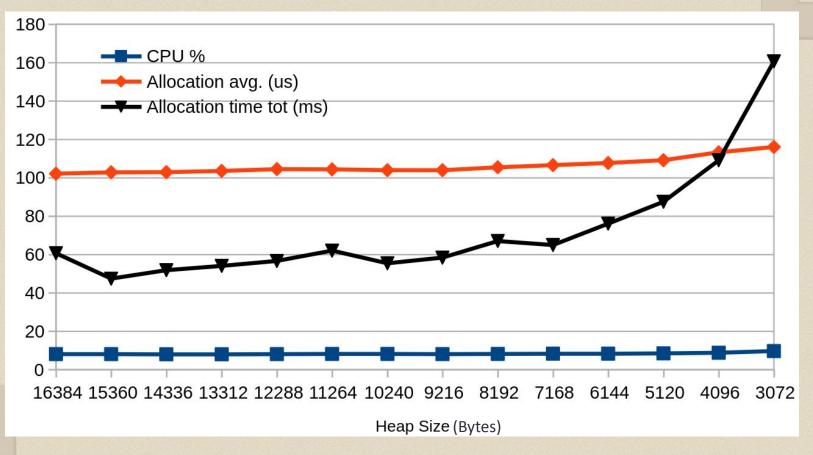
CASE STUDY



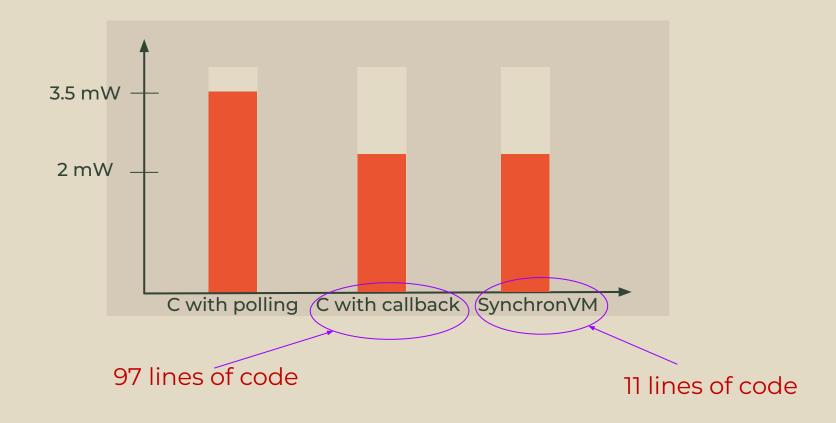


Soft real-time
 ~440 Hz note
 frequency

Measurements



Button Blinky Power Usage



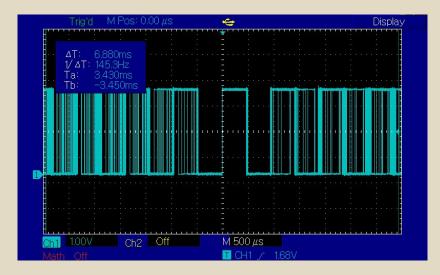
Jitter and Precision

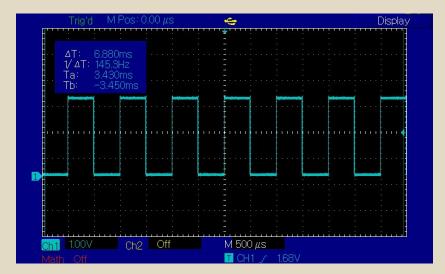
```
while (1) {
  uint32_t state = GPI0_READ(23);
  if (state) {
    GPI0_CLR(23);
  } else {
    GPI0_SET(23);
  }
  usleep(400);
  }
// main method and other setup elided
```

```
ledchan = channel ()
foo : Int -> ()
foo val =
let _ = syncT 500 0 (send ledchan val)
  in foo (not val)
main =
let _ = spawnExternal ledchan 1
  in foo 1
```

1 KHz Square Wave

Jitter and Precision





C / Raspberry Pi

Synchron/STM32F4

1 KHz Square Wave



Contributions

Attacker Model 1



HasTEE⁺

for reducing **trust** on low-level software

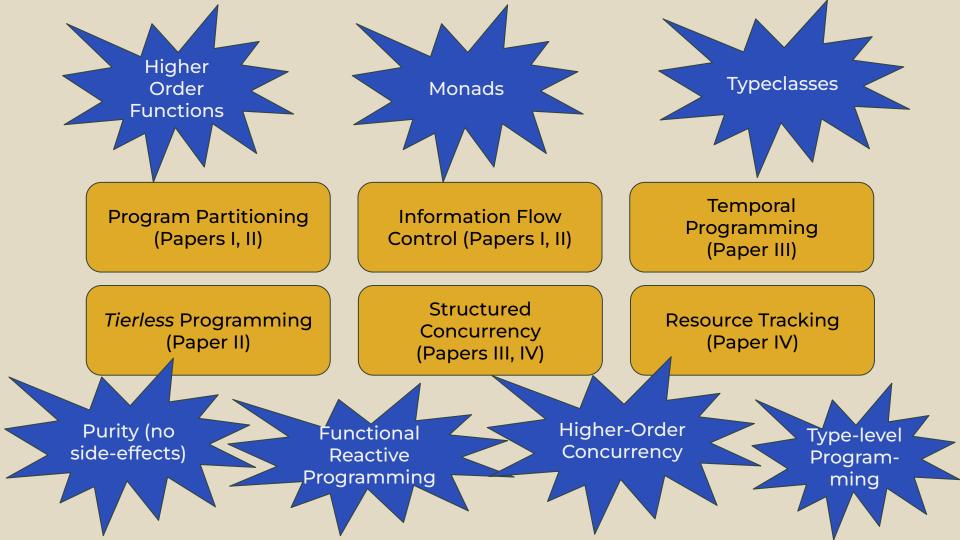
Attacker Model 2



SynchronVM

for *memory-safe*, *soft real-time* embedded systems

"Securing Digital Systems through Programming Language Techniques"



"Securing Digital Systems through Functional Programming Abstractions"

Future Work





Future Work

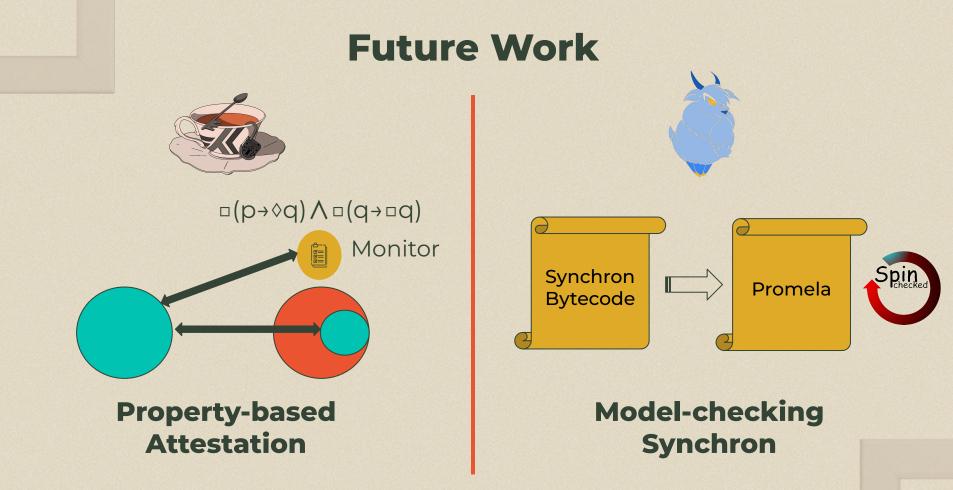


□(p→◊q)∧□(q→□q)

Mor

Property-based Attestation





ACKNOWLEDGEMENT

Thanks to Andrea Svensson for the cool logos.



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Thanks to the SSF Octopi project for funding this research.

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Thanks to my co-authors.



Mary



Joel







Alejandro

Robert

Koen

THANKS!

https://github.com/Abhiroop/HasTEE

https://github.com/SynchronVM/SynchronVM

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