

# A Monadic Analysis of Information-Flow Security with Mutable State

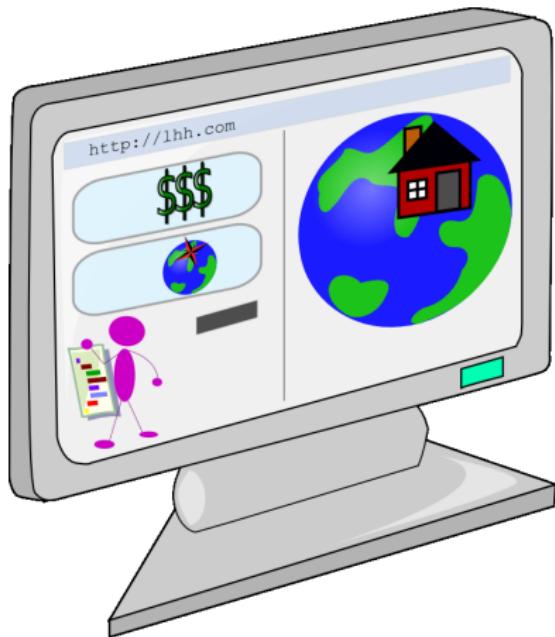
## Enforcing Secrecy with Types

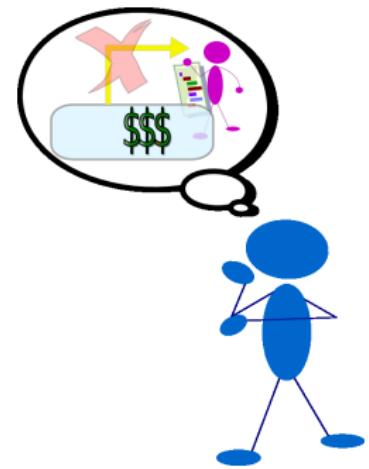
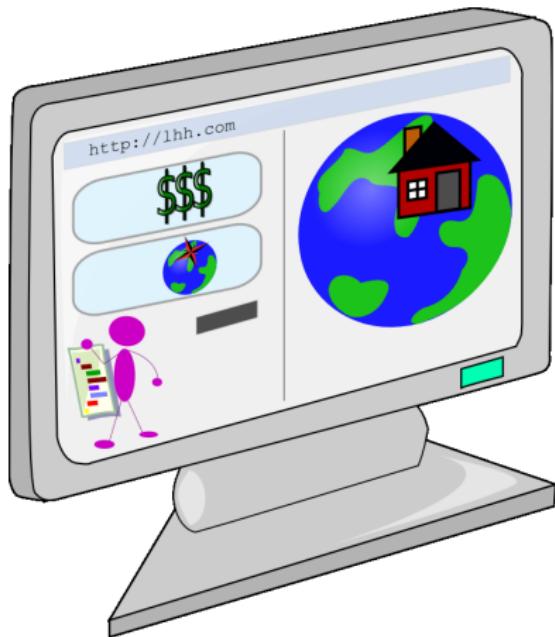
Aleksey Kliger  
joint work with  
Karl Crary and Frank Pfenning

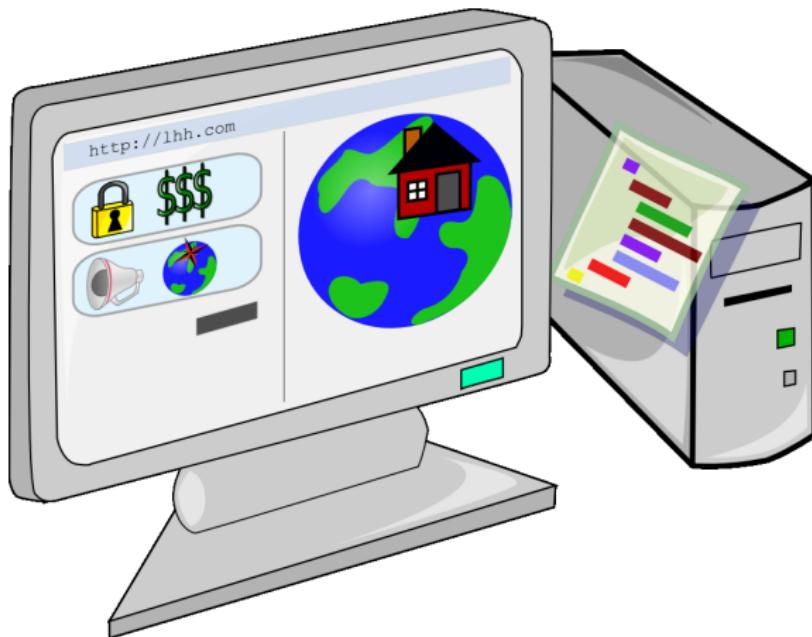
October 21, 2005 / Student Seminar Series

# Helen shops for a house









## Running untrusted code

Helen wants

A guarantee that Luke cannot  
learn income

Luke wants

Reasonable burden of proof

# Running untrusted code

Language-based information flow security.

Type system tracks flow of information.

Well typed programs do not leak secrets.



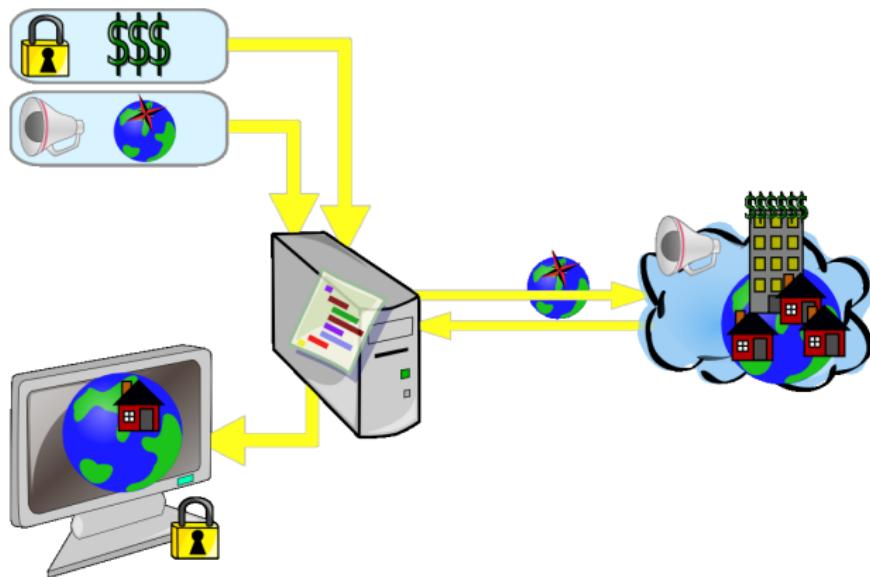
Helen wants

A guarantee that Luke cannot  
learn income

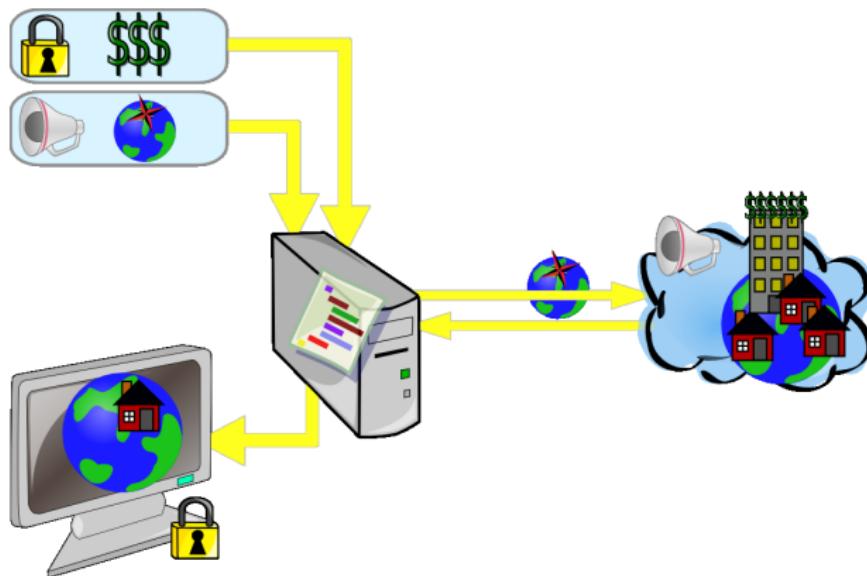
Luke wants

Reasonable burden of proof

# Information flow

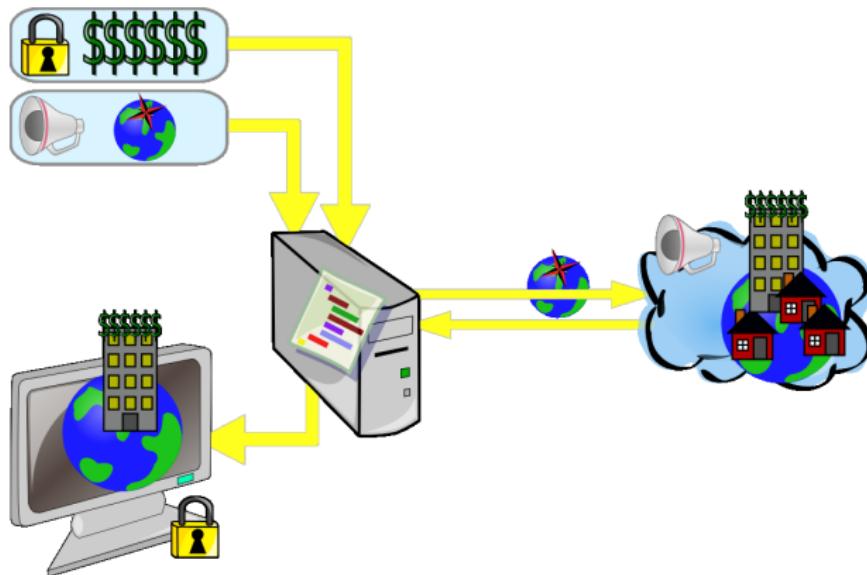


# Information flow



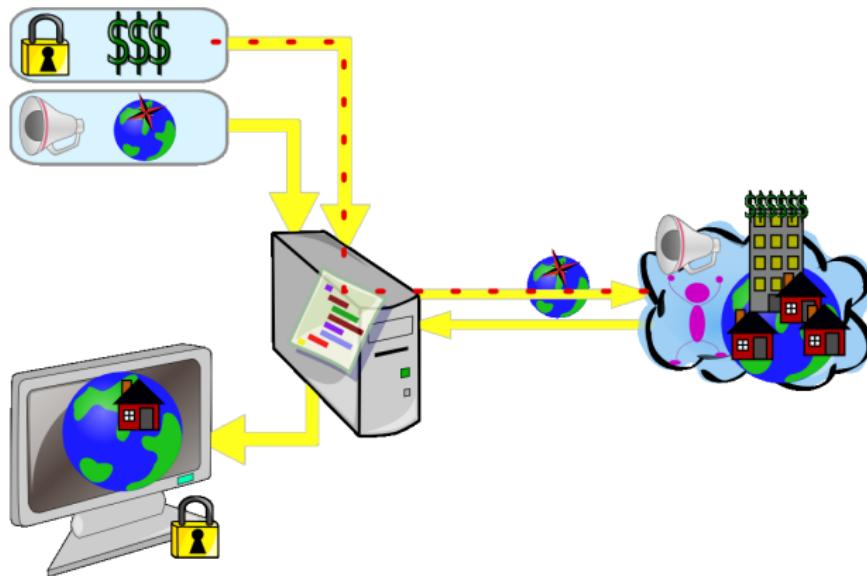
Luke thinks  
Someone wants  
a house in  
Oakland

# Information flow



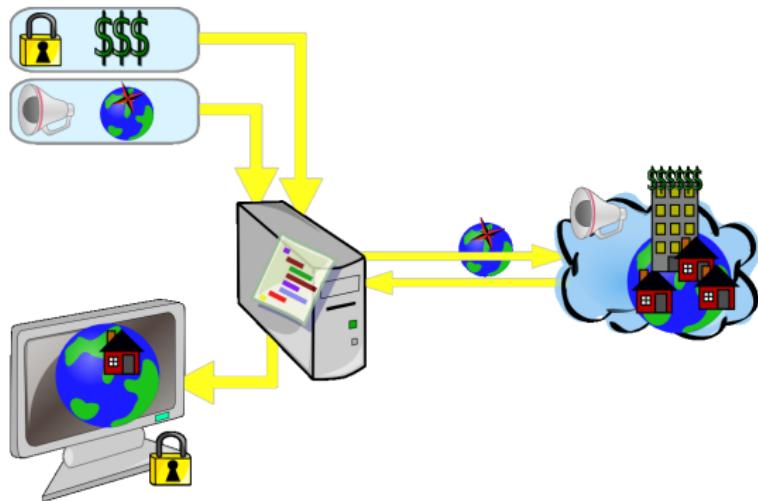
Luke thinks  
Someone wants  
a house in  
Oakland

# Information flow

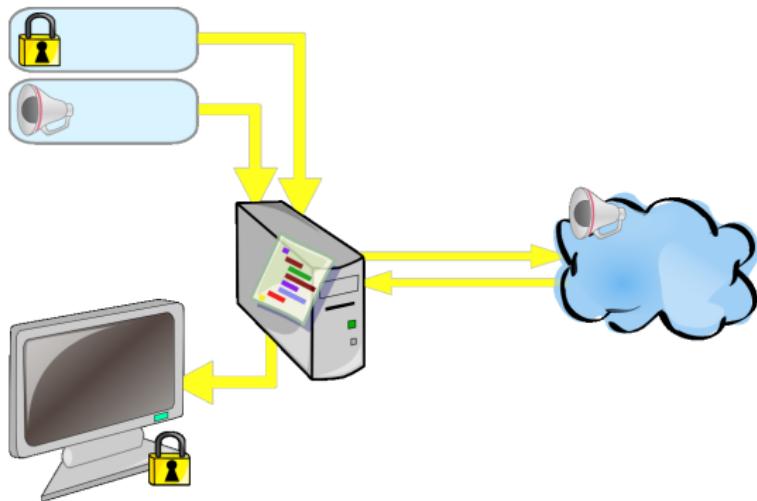


Luke thinks  
Someone wants  
a **cheap** house in  
Oakland

# Abstracting away



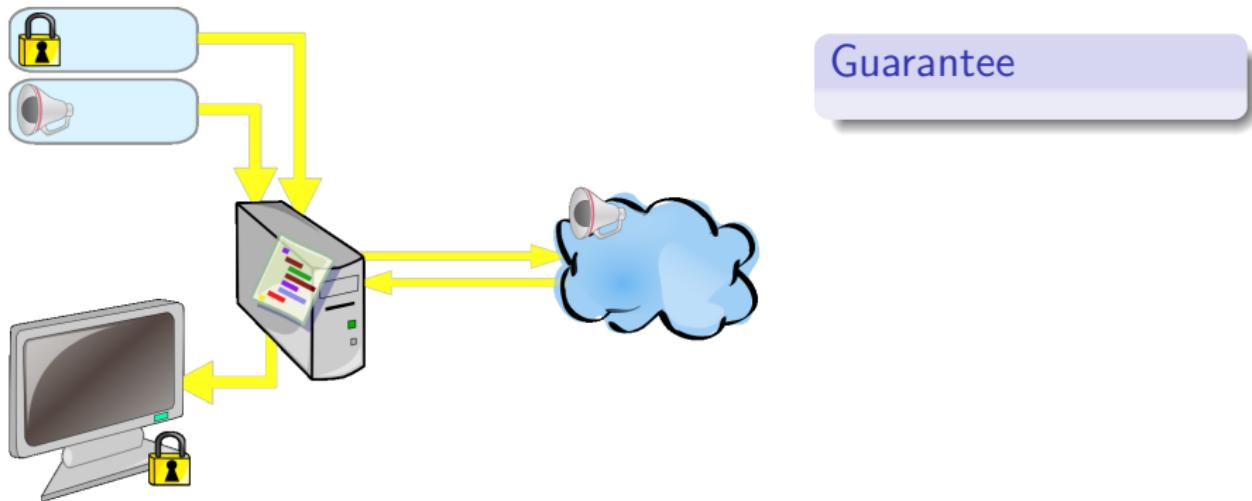
# Abstracting away



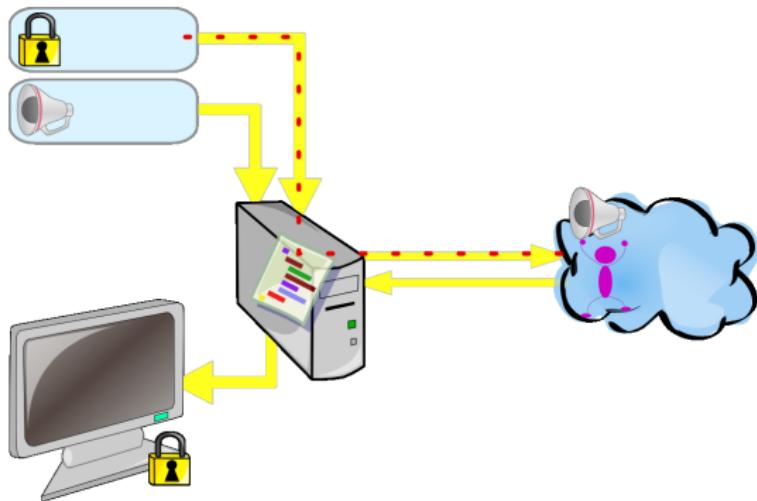
## Situation

- Untrusted program
- Private data
- Public data
- Must access both

# Abstracting away



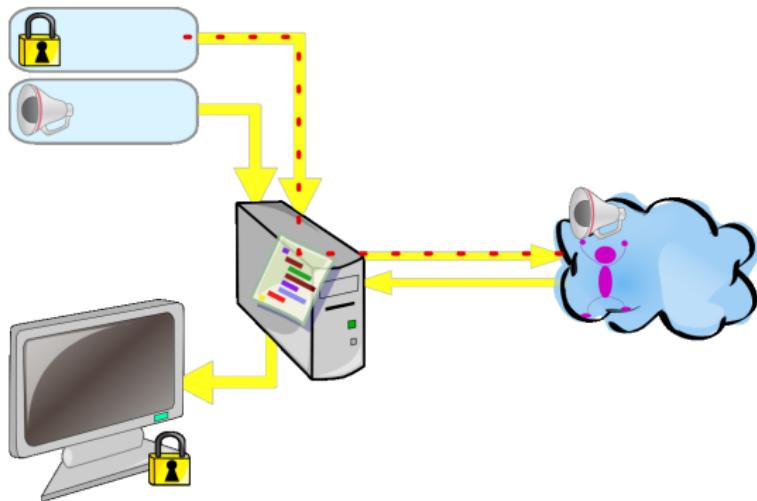
# Abstracting away



## Guarantee

No information flow of  
*high-security data* to  
*low-security observer*.

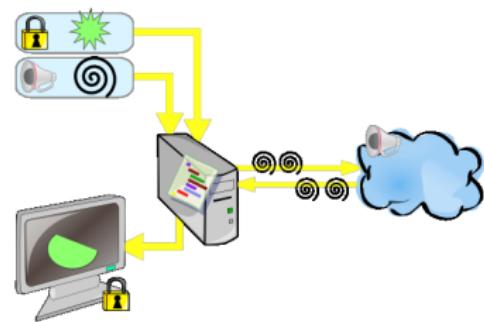
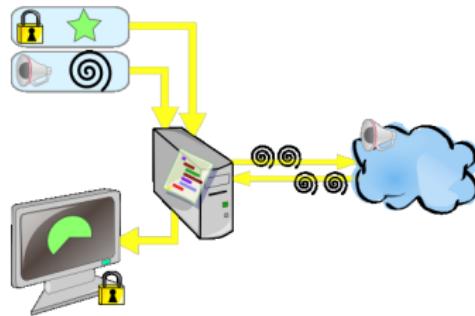
# Abstracting away



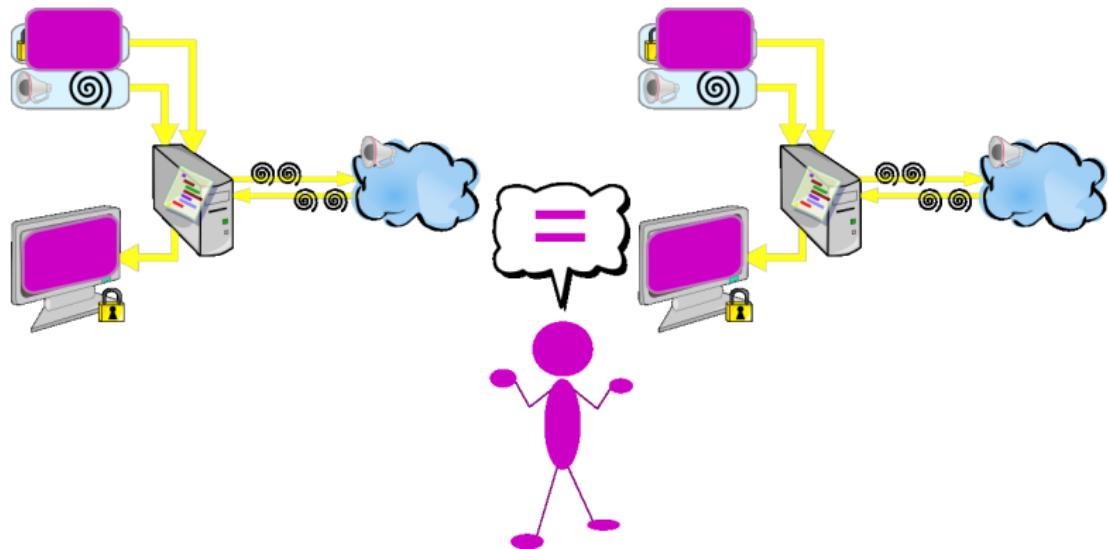
## Guarantee

The high-security data does not interfere with the low-security behavior of the program.

## Non-interference



## Non-interference



# Outline

## 1 Introduction

Motivation

Abstracting Away

## 2 Types of Information Flow

Direct Information Flow

Indirect: Control Flow

## 3 Monads

Suspensions and Effects

Monadic Security

Informativeness

## 4 Related and Future Work

# Direct information flow

First try at LHH.com

## Example

```
fun processForm () {  
    housesSpeaker :=  
        fetchHouses (zipcodeField);  
    priceRangeLock :=  
        calcPriceRange (incomeField);  
    showJustAffordable (houses,  
                        priceRange);  
}
```

# Direct information flow

First try at LHH.com

## Example

```
fun processForm () {  
    housesSpeaker :=  
        fetchHouses (zipcodeField);  In: Speaker, Speaker, Out: Speaker, Speaker. ✓  
    priceRangeLock :=  
        calcPriceRange (incomeField);  
    showJustAffordable (houses,  
                        priceRange);  
}
```

# Direct information flow

First try at LHH.com

## Example

```
fun processForm () {  
    housesSpeaker :=  
        fetchHouses (zipcodeField);  
    priceRangeLock :=  
        calcPriceRange (incomeField); In: 🔒, Out: 🔒. ✓  
    showJustAffordable (houses,  
                        priceRange);  
}
```

# Direct information flow

First try at LHH.com

## Example

```
fun processForm () {  
    houses :=  
        fetchHouses (zipcodeField);  
    priceRange :=  
        calcPriceRange (incomeField);  
    showJustAffordable (houses,  
                        priceRange);  In:  Out: 

}


```

# Direct information flow

First try at LHH.com

## Example

```
fun processForm () {  
    houses :=  
        fetchHouses (zipcodeField);  
    priceRange :=  
        calcPriceRange (incomeField);  
    showJustAffordable (houses,  
                        priceRange);  In: ,  Out:  ?  
}
```

# Direct information flow

First try at LHH.com

## Example

```
fun processForm () {  
    houses  To Combine Inputs: Maximum  
    fetchHo  
    priceRange  max(, ) =   
    calcPriceRange (incomeField);  
    showJustAffordable (houses,  
        priceRange); In:  Out:  ✓  
}
```

# Direct information flow

Another try at LHH.com

## Example (What if houses is secret)

```
fun processForm () {  
    houses🔒 :=  
        fetchHouses (zipcodeField);  
    priceRange🔒 :=  
        calcPriceRange (incomeField);  
    showJustAffordable (houses,  
                        priceRange);  
}
```

# Direct information flow

Another try at LHH.com

## Example (What if houses is secret)

```
fun processForm () {  
    houses🔒 :=  
        fetchHouses (zipcodeField);  In: 🔊, 🔊, Out: 🔒, 🔊. ?  
    priceRange🔒 :=  
        calcPriceRange (incomeField);  
    showJustAffordable (houses,  
                        priceRange);  
}
```

# Direct information flow

Another try at LHH.com

## Example (What if houses is secret)

```
fun processForm () {  
    houses🔒 :=  
        fetchHouses (zipcodeField);  In: 🔊, Out: 🔊. ✓  
    priceRange🔒 :=  
        calcPriceRange (houses);  
    showJustA  
    }  
}
```

To Combine Outputs: Minimum

$$\min(\text{🔒}, \text{🔊}) = \text{🔊}$$

# Direct information flow

Another try at LHH.com

## Example (What if houses is secret)

```
fun processForm () {  
    houses🔒 :=  
        fetchHouses (zipcodeField);  
    priceRange🔒 :=  
        calcPriceRange (incomeField);  In: 🔒, Out: 🔒. ✓  
    showJustAffordable (houses,  
                        priceRange);  
}
```

# Direct information flow

Another try at LHH.com

## Example (What if houses is secret)

```
fun processForm () {  
    houses🔒 :=  
        fetchHouses (zipcodeField);  
    priceRange🔒 :=  
        calcPriceRange (incomeField);  
    showJustAffordable (houses,  
                        priceRange);  In: 🔒, 🔒 Out: 🔒, ✓  
}
```

## Indirect information flow

### Example (LHH.com “I’m Feeling Lucky” )

- ① Fetch a random house in the zipcode
- ② If not in the price range, go back to (1)
- ③ Otherwise show the house

## Indirect information flow

### Example (Simplified)

```
randHouseoculars :=  
    fetchRandom (zipcodeField);  
if (not (isInPriceRange  
        (randHouse,  
         priceRangepadlock)))  
then  
    randHouseoculars :=  
        fetchRandom  
        (zipCodeField);  
showHouse (randHouse)
```

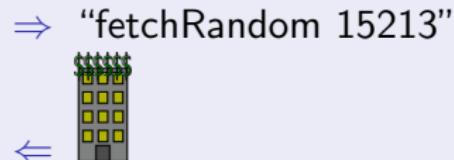
### Interaction

## Indirect information flow

### Example (Simplified)

```
randHouse :=  
    fetchRandom (zipcodeField);  
if (not (isInPriceRange  
        (randHouse,  
         priceRange🔒)) )  
then  
    randHouse :=  
        fetchRandom  
        (zipCodeField);  
showHouse (randHouse)
```

### Interaction



## Indirect information flow

### Example (Simplified)

```
randHouse :=  
    fetchRandom (zipcodeField);  
if (not (isInPriceRange  
            (randHouse,  
             priceRange🔒)))  
then  
    randHouse :=  
        fetchRandom  
        (zipCodeField);  
showHouse (randHouse)
```

### Interaction

⇒ "fetchRandom 15213"  
  
⇐

## Indirect information flow

### Example (Simplified)

```
randHouse :=  
    fetchRandom (zipcodeField);  
if (not (isInPriceRange  
        (randHouse,  
         priceRangelock)))  
then  
    randHouse :=  
        fetchRandom  
        (zipCodeField);  
showHouse (randHouse)
```

### Interaction

⇒ "fetchRandom 15213"



⇒ "fetchRandom 15213"

Luke: \$\$\$

## Indirect information flow

### Example (Simplified)

```
randHouse :=  
    fetchRandom (zipcodeField);  
if (not (isInPriceRange  
        (randHouse,  
         priceRange🔒)) )  
then  
    randHouse :=  
        fetchRandom  
        (zipCodeField);  
showHouse (randHouse)
```

### Interaction

⇒ "fetchRandom 15213"  




## Indirect information flow

### Example (Simplified)

```
randHouse :=  
    fetchRandom (zipcodeField);  
if (not (isInPriceRange  
            (randHouse,  
             priceRange🔒)))  
then  
    randHouse :=  
        fetchRandom  
        (zipCodeField);  
showHouse (randHouse)
```

### Interaction

⇒ "fetchRandom 15213"  
←

## Indirect information flow

### Example (Simplified)

```
randHouse :=  
    fetchRandom (zipcodeField);  
if (not (isInPriceRange  
        (randHouse,  
         priceRange🔒)) )  
then  
    randHouse :=  
        fetchRandom  
        (zipCodeField);  
showHouse (randHouse)
```

### Interaction

⇒ "fetchRandom 15213"



⇐

⇒ nothing

Luke: \$\$\$\$\$

## Indirect information flow, cont'd

### Example (Simplified)

```
if (not (isInPriceRange  
         (randHouse,  
          priceRange🔒)))  
then  
    randHouse💻 :=  
        fetchRandom  
        (zipCodeField);
```

### Principle

Security level of a conditional  
is an *implicit input* to the  
branches.

### Example

In: 🔑, 🔑, 🔒 Out: 🔑, 🔑 ✗

# Outline

## 1 Introduction

Motivation

Abstracting Away

## 2 Types of Information Flow

Direct Information Flow

Indirect: Control Flow

## 3 Monads

Suspensions and Effects

Monadic Security

Informativeness

## 4 Related and Future Work

# Why Monads?

## Problems with traditional languages

- ① Every expression may have an effect (I/O, memory read/write) and this is not reflected in the types
- ② Complicated control flow — indirect information flow

# A monadic language for security

## Definition (Monad)

A value of type  $\bigcirc A$  is a **suspended computation**, that *each time it is forced to execute will*

- return a (possibly different) result of type  $A$
- potentially produce some effects

## Note

And expressions of all other types are *pure* (do not have effects).

# A monadic language for security

## Definition (Monad)

A value of type  $\textcircled{O}A$  is a **suspended computation**, that *each time it is forced to execute will*

- return a (possibly different) result of type  $A$
- potentially produce some effects

## Forcing suspended computations

No way to force  $\textcircled{O}A$ , to get  $A$ . Only build up larger composite computations.

Runtime forces `main : O()`.

# Writing programs with monads

Values of  $\bigcirc A$

```
do
    stmt_1
    stmt_2
    ...
expr
```

Example (increment)

```
inc : (Ptr Int, Int)
      →  $\bigcirc$ Int
fun inc (ptr, amt) =
do
    ...
```

# Writing programs with monads

## Statements

```
var ← expr
```

## Expressions

```
do stmts  
deref expr
```

## Example (increment)

```
inc : (Ptr Int, Int)  
      → ⌠Int  
fun inc (ptr, amt) =  
do  
  oldVal ← deref ptr  
  ...
```

# Writing programs with monads

## Statements

```
var ← expr  
expr
```

## Expressions

```
do stmts  
deref expr  
expr := expr
```

## Example (increment)

```
inc : (Ptr Int, Int)  
      → ⌠Int  
fun inc (ptr, amt) =  
do  
    oldVal ← deref ptr  
    ptr := oldVal + amt  
    ...
```

# Writing programs with monads

## Statements

```
var ← expr  
expr
```

## Expressions

```
do stmts  
deref expr  
expr := expr  
pure expr
```

## Example (increment)

```
inc : (Ptr Int, Int)  
      → ⌠Int  
fun inc (ptr, amt) =  
do  
    oldVal ← deref ptr  
    ptr := oldVal + amt  
    pure oldVal
```

# Writing programs with monads

## Statements

```
var ← expr  
expr
```

## Expressions

```
do stmts  
deref expr  
expr := expr  
pure expr
```

---

```
var  
if (expr)  
    then expr  
    else expr  
func (args)
```

## Example (increment)

```
inc : (Ptr Int, Int)  
      → ○Int  
fun inc (ptr, amt) =  
do  
    oldVal ← deref ptr  
    ptr := oldVal + amt  
pure oldVal
```

# Control flow and monads

## Example

*repeatUntil* :

$(A \rightarrow \text{Bool}, \bigcirc A) \rightarrow \bigcirc A$

**fun** *repeatUntil*

    (*test*, *comp*) =

**do**

*x*  $\leftarrow$  *comp*

**if** (*test* (*x*))

**then pure** *x*

**else repeatUntil**

            (*test*, *comp*)

# Control flow and monads

## Example

```
repeatUntil :  
  (A → Bool, ○A) → ○A  
fun repeatUntil  
  (test, comp) =  
do  
  x ← comp  
  if (test (x))  
    then pure x  
  else repeatUntil  
    (test, comp)
```

## Example (Sample Output)

State = {ptr ↦ 0}

repeatUntil (above100,  
 inc (ptr, 1))

# Control flow and monads

## Example

```
repeatUntil :  
  (A → Bool, □A) → □A  
fun repeatUntil  
  (test, comp) =  
do  
  x ← comp  
  if (test (x))  
    then pure x  
  else repeatUntil  
    (test, comp)
```

## Example (Sample Output)

State = {ptr ↦ 0}

```
do  
  x ← inc (ptr, 1)  
  if (above100 (x))  
    then pure x  
  else repeatUntil  
    (above100,  
     inc(ptr, 1))
```

# Control flow and monads

## Example

```
repeatUntil :  
  ( $A \rightarrow \text{Bool}$ ,  $\bigcirc A$ )  $\rightarrow \bigcirc A$   
fun repeatUntil  
  (test, comp) =  
do  
  x  $\leftarrow$  comp  
  if (test (x))  
    then pure x  
  else repeatUntil  
    (test, comp)
```

## Example (Sample Output)

State = {ptr  $\mapsto 0$ }

```
do  
   $\Rightarrow x \leftarrow inc(ptr, 1)$   
  if (above100 (x))  
    then pure x  
  else repeatUntil  
    (above100,  
     inc(ptr, 1))
```

# Control flow and monads

## Example

```
repeatUntil :  
  (A → Bool, ○A) → ○A  
fun repeatUntil  
  (test, comp) =  
do  
  x ← comp  
  if (test (x))  
    then pure x  
  else repeatUntil  
    (test, comp)
```

## Example (Sample Output)

State = {ptr ↪ 1}

```
do  
  x ← inc (ptr, 1)  
⇒ if (above100 (0))  
  then pure 0  
  else repeatUntil  
    (above100,  
     inc(ptr, 1))
```

# Control flow and monads

## Example

```
repeatUntil :  
  (A → Bool, ○A) → ○A  
fun repeatUntil  
  (test, comp) =  
do  
  x ← comp  
  if (test (x))  
    then pure x  
  else repeatUntil  
    (test, comp)
```

## Example (Sample Output)

```
State = {ptr ↪ 1}  
if (above100 (0))  
  then pure 0  
  else repeatUntil  
    (above100,  
     inc (ptr, 1))
```

# Control flow and monads

## Example

```
repeatUntil :  
  (A → Bool, ○A) → ○A  
fun repeatUntil  
  (test, comp) =  
do  
  x ← comp  
  if (test (x))  
    then pure x  
  else repeatUntil  
    (test, comp)
```

## Example (Sample Output)

```
State = {ptr ↪ 1}  
  
repeatUntil  
  (above100,  
   inc (ptr, 1))
```

# Control flow and monads

## Example

```
repeatUntil :  
  (A → Bool, ○A) → ○A  
fun repeatUntil  
  (test, comp) =  
do  
  x ← comp  
  if (test (x))  
    then pure x  
  else repeatUntil  
    (test, comp)
```

## Example (Sample Output)

```
State = {ptr ↪ 1}  
  
repeatUntil  
  (above100,  
   inc (ptr, 1))
```

## Monadic version of LHH.com

### Original version

```
fun processForm () {  
    houses := fetchHouses (zipcodeField);  
    priceRange := calcPriceRange (incomeField);  
    showJustAffordable (houses, priceRange);  
}
```

# Monadic version of LHH.com

## Monadic Version

```
fun processForm () =  
do  
    housesSpeaker := fetchHouses (zipcodeField)  
    priceRangeLock := calcPriceRange (incomeField)  
    showJustAffordable (houses, priceRange)
```

# Monadic version of LHH.com

## Types

```
fetchHouses : Ptr ZipCode → ⌂ List House
```

## Monadic Version

```
fun processForm () =  
do  
    housesSpeaker := fetchHouses (zipcodeField)  
    priceRangeLock := calcPriceRange (incomeField)  
    showJustAffordable (houses, priceRange)
```

# Monadic version of LHH.com

## Types

### Monadic Version

```
fun processForm () =  
do  
    h ← fetchHouses (zipcodeField)  
    housesSpeaker := h  
    priceRangeLock := calcPriceRange (incomeField)  
    showJustAffordable (houses, priceRange)
```

# Monadic version of LHH.com

## Types

*calcPriceRange : Int → Range*

## Monadic Version

```
fun processForm () =  
do  
    h ← fetchHouses (zipcodeField)  
    housesSpeaker := h  
    priceRangeLock := calcPriceRange (incomeField)  
    showJustAffordable (houses, priceRange)
```

# Monadic version of LHH.com

## Types

### Monadic Version

```
fun processForm () =  
do  
    h ← fetchHouses (zipcodeField)  
    housesSpeaker := h  
    i ← deref incomeField  
    priceRangeLock := calcPriceRange (i)  
    showJustAffordable (houses, priceRange)
```

# Monadic version of LHH.com

## Types

*showJustAffordable : (Ptr List House, Ptr Range) → ○()*

## Monadic Version

```
fun processForm () =  
do  
    h ← fetchHouses (zipcodeField)  
    housesSpeaker := h  
    i ← deref incomeField  
    priceRangeLock := calcPriceRange (i)  
    showJustAffordable (houses, priceRange)
```

# Idiomatic monadic version of LHH.com

## Types

*showJustAffordable : (List House, Range) → ○()*

## Simplified

```
fun processForm () =  
do  
    h ← fetchHouses (zipcodeField)  
    i ← deref incomeField  
    showJustAffordable (h, calcPriceRange (i))
```

## Idiomatic monadic version of LHH.com

### Simplified

```
fun processForm () =  
do  
  h ← fetchHouses (zipcodeField)  
  do  
    i ← deref incomeField  
    showJustAffordable (h, calcPriceRange (i))
```

# So what about security?

## Idea

Track security levels of input and output in the monad:   A

# LHH.com with security monads

## Types

### Code unchanged

```
fun processForm () =  
do  
    h ← fetchHouses (zipcodeField)  
    do  
        i ← deref incomeField  
        showJustAffordable (h, calcPriceRange (i))
```

# LHH.com with security monads

## Types

*fetchHouses : Ptr ZipCode → ⚡ List House*

## Code unchanged

```
fun processForm () =  
do  
    h ← fetchHouses (zipcodeField)  
    do  
        i ← deref incomeField  
        showJustAffordable (h, calcPriceRange (i))
```

# LHH.com with security monads

## Types

```
deref incomeField : ○ Int
```

## Code unchanged

```
fun processForm () =  
do  
    h ← fetchHouses (zipcodeField)  
    do  
        i ← deref incomeField  
        showJustAffordable (h, calcPriceRange (i))
```

# LHH.com with security monads

## Types

*showJustAffordable* : (**List** House, Range) → ○<sub>•, </sub> ()

## Code unchanged

```
fun processForm () =  
do  
    h ← fetchHouses (zipcodeField)  
    do  
        i ← deref incomeField  
        showJustAffordable (h, calcPriceRange (i))
```

# Composing suspensions

Portion of processForm

do

i ← **deref** incomeField : ○ Int

showJustAffordable

(h, calcPriceRange (i)) : ○ ()

# Composing suspensions

Portion of processForm

do

```
i ← deref incomeField      : ○,● Int  
showJustAffordable  
    (h, calcPriceRange (i))   : ○,● ()  
: ○,● ()
```

## Composing suspensions, cont'd

```
processForm
```

```
do
```

```
  h ← fetchHouses  
    (zipcodeField) : ○ 🔍, 🔊 List House  
do ... : ○ 🔒 ()
```

## Composing suspensions, cont'd

Compose Inputs

Compose Outputs

processForm

$\max(\text{Speaker}, \text{Lock}) = \text{Lock}$

$\min(\text{Speaker}, \text{Lock}) = \text{Speaker}$

do

$h \leftarrow fetchHouses$

$(zipcodeField) : \bigcirc \text{Speaker}, \text{Speaker} \text{ List House}$

$\text{do} \dots : \bigcirc \text{Lock}, \text{Lock} ()$

$: \bigcirc \text{Lock}, \text{Speaker} ()$

## What are the types telling us?

Suppose `showJustAffordable` had type

$(List\ House, Range) \rightarrow \bigcirc_{\bullet, \text{🔒}} Int$

Consider

`do`

```
nHouses ← do
    i ← deref incomeField
    showJustAffordable ...
    : ○bullet, 🔒 Int
sendL (nHouses) : ○bullet, 🔊 ()
```

$()$  is not informative

## Definition

A type  $A$  is **not informative** at low-security  
if no computation with only low input could make use of it

## Theorem

*Non-interference is preserved if for any  $A$  that is not informative at low-security, we promote  $\bigcirc_{\square,\square} A$  to  $\bigcirc_{\bullet,\square} A$*

processForm is well-typed

## Promote the inner do-block

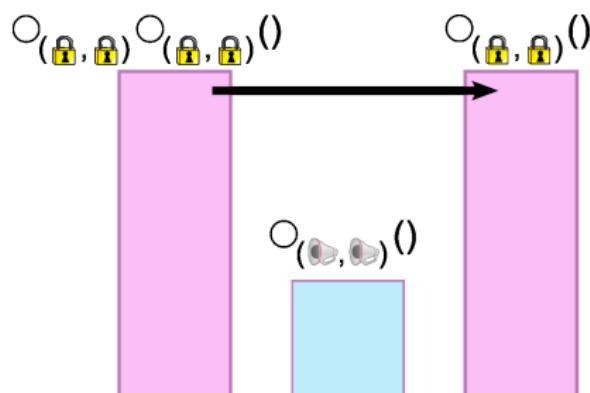
```
fun processForm () =  
do  
    h ← fetchHouses (zipcodeField) : ○, List House  
    do  
        i ← deref incomeField  
        showJustAffordable (...)  
        : ○, ()  
    : ○, ()
```

## Other non-informative types?

### Not informative for low security

- $A \rightarrow B$  not informative, whenever  $B$  isn't
- $\mathbf{Ptr}_{\text{🔓}} A$  is not informative
- $\bigcirc_{\text{🔓}} A$  is not informative, whenever  $A$  isn't

# Secure computation continuation passing

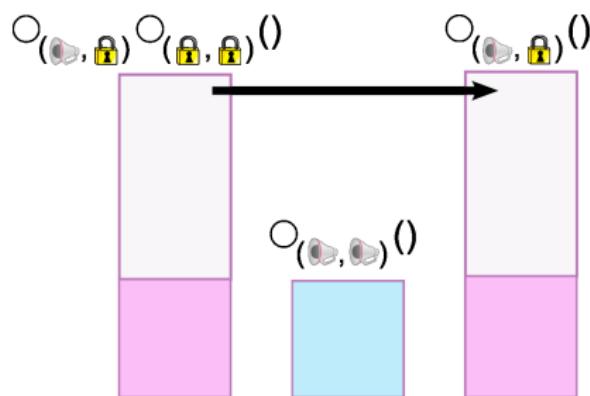


## Example

**do**

```
cont ← highComp  
lowComp  
cont
```

# Secure computation continuation passing



## Example

**do**

```
cont ← highComp  
lowComp  
cont
```

# Is it still secure?

Yes



# Outline

## 1 Introduction

Motivation

Abstracting Away

## 2 Types of Information Flow

Direct Information Flow

Indirect: Control Flow

## 3 Monads

Suspensions and Effects

Monadic Security

Informativeness

## 4 Related and Future Work

## Related work

### Monads in language design

#### Foundations

- Semantics [Moggi 1989]

#### Have been used for:

- I/O in Haskell [Peyton-Jones, *et al.* 1993]
- Parsing Combinators [Wadler 1992]
- Composable Transactional Memory [Peyton-Jones, *et al.* 2005]
- Probabilistic Computation [Park *et al.* 2005]
- and much more...

## Related work

### Language-based security

#### Non-interference:

- [Volpano, *et al.* 1996]
- SLam [Heintze, *et al.* 1998], DCC [Abadi *et al.* 1999]
- CoreML<sup>2</sup> [Pottier, *et al.* 2003]
- and many others ... [Sabelfeld, *et al.* 2003]

#### Extensions:

- Concurrency [Honda, *et al.* 2002]
- Timing channels [Agat 2000]
- Robust declassification [Zdancewic, *et al.* 2001], [Myers, *et al.* 2004]
- and many others...

## Our contributions

- Monads for tracking information flow
- Informativeness

# Monads for tracking information flow

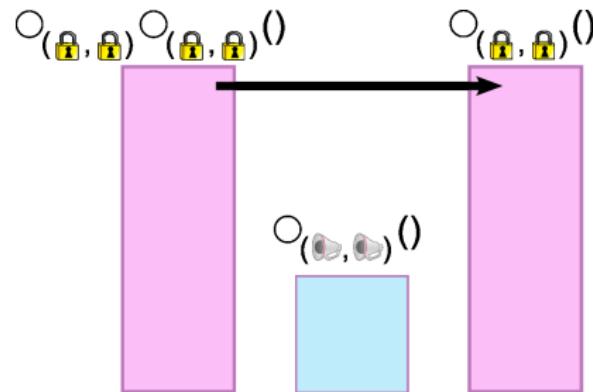
Isolate security concerns: simplify reasoning  
Only monads and channels are tagged

## Example

*fetchHouses : Ptr ZipCode → ○, List House*  
*calcPriceRange : Int → Range*

## Informativeness

Allow high-security computations to pass temporary results through low-security computations



## Future work

Push out Concurrency (e.g. transactional memory),  
robust declassification

Push down Security-Typed Assembly Language

Thanks

Questions?



# The three monad laws

Program equivalences

Within each security level, we obey the monad laws

(Upcalls are an additional relationship between monad families)

① **do**  $x \leftarrow \mathbf{pure} \text{ expr}$   
 $func(x)$

① **do**  
 $func(expr)$

② **do**  $x \leftarrow comp$   
**pure**  $x$

② **do**  
 $comp$

③ **do**  $y \leftarrow \mathbf{do}$   
 $x \leftarrow comp1$   
 $comp2(x)$   
 $comp3(y)$

③ **do**  
 $x \leftarrow comp1$   
 $y \leftarrow comp2(x)$   
 $comp3(y)$

# Differences in the paper

## Additions in the paper

- Full lattice of security levels
- A proof of non-interference
- Discussion of allocation
- Encoding of a prior work

## Stylistic differences

- No  $\bullet$  for “no interesting reads/writes,” use  $\perp$ ,  $\top$
- “ $A$  informative only above 