

# Do compilers respect programmers?

William J. Bowman

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# Do compilers respect programmer *invariants*?

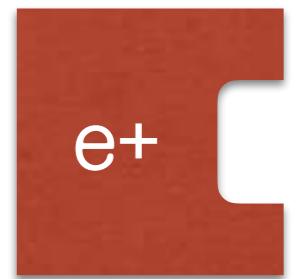
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# Compilers have one job

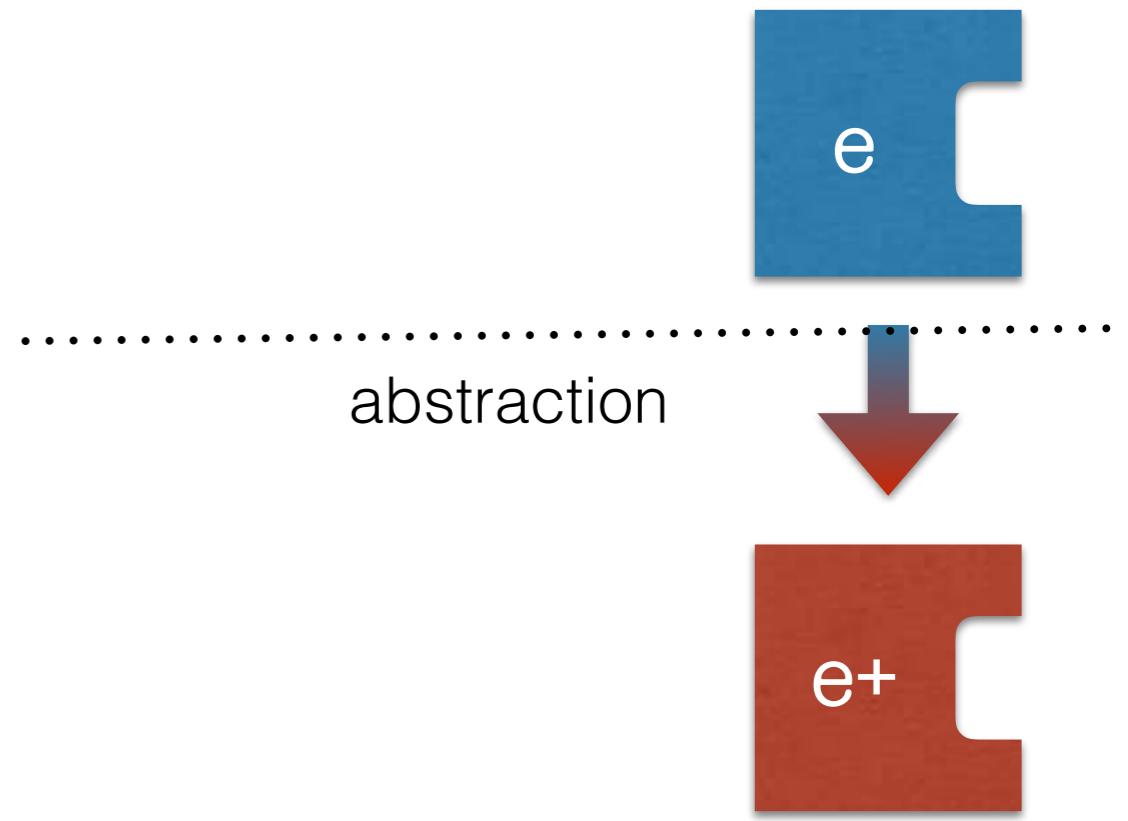
Happy source program



Gross machine code

# Compilers have one job

Happy source program

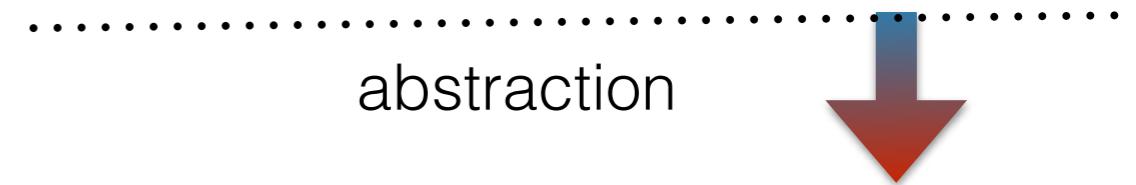


Gross machine code

# Compilers have one job

Happy source program

Abstraction helps programmers design *invariants*:  
logical assertions that should always hold



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Happy source program

Abstraction helps programmers design *invariants*:  
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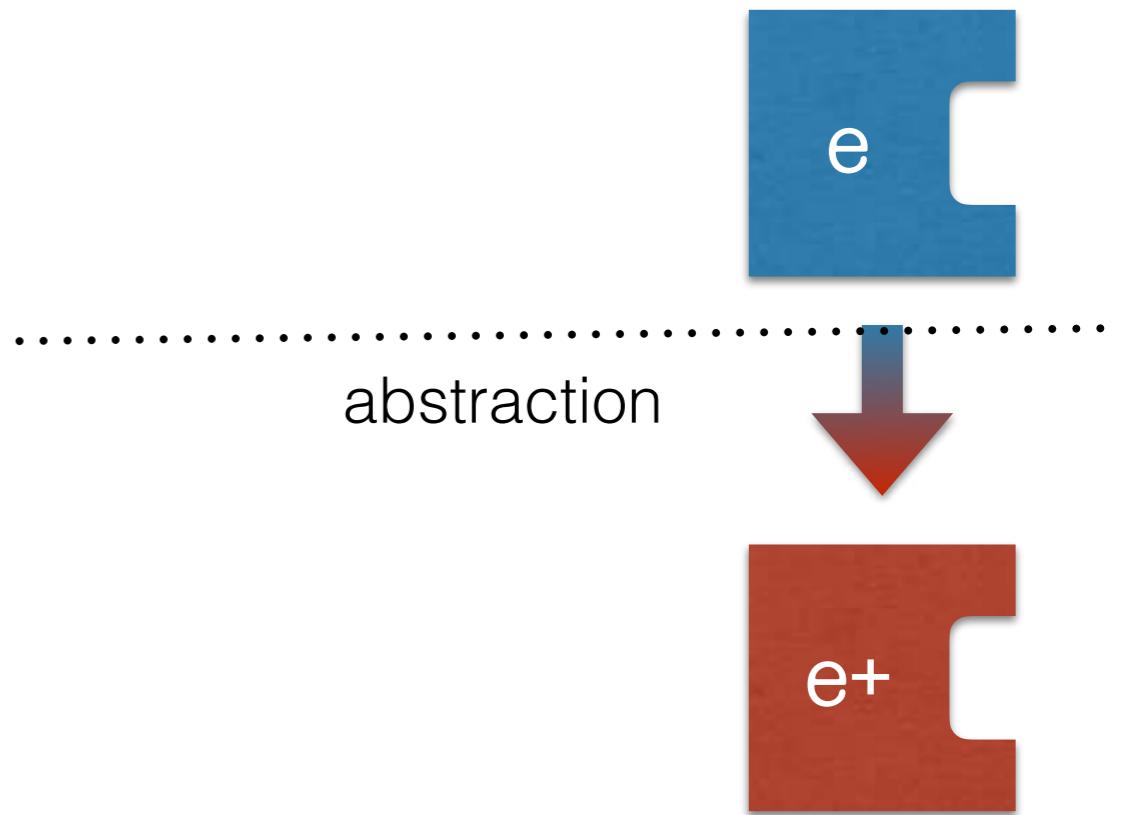
- Performance
- Correctness
- Security



Gross machine code

# and compilers *don't do it*

✓ Happy source program



✗ Gross machine code

# Three key problems

Often,

1. Programmers can't express invariants
2. Compilers don't respect invariants
3. Linkers don't enforce invariants

# Three key problems

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1. Programmers can't express invariants

“invariant”:  
Belief or intent

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In:

- Optimization
- Code generation

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“invariant”:  
Belief or intent

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In:

- Optimization
- Code generation

3. Linkers don't enforce invariants

On external code,  
violating intent

# Examples of Problem 1

Often,

1. Programmers can't express invariants

“invariant”:  
Belief or intent

2. Compilers don't respect invariants

In:

- Optimization
- Code generation

3. Linkers don't enforce invariants

On external code,  
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# Programmers can't express invariants

Example: Mars Climate Orbiter

“Invariant”	Ground control calculated <i>Impulse</i> in <i>newton seconds</i>
Actually	<i>Impulse</i> calculated in <i>pound-force seconds</i>
Behavior	

# Programmers can't express invariants

Example: Mars Climate Orbiter

<b>“Invariant”</b>	Ground control calculated <i>Impulse</i> in <i>newton seconds</i>
<b>Actually</b>	<i>Impulse</i> calculated in <i>pound-force seconds</i>
<b>Behavior</b>	Unscheduled disintegration



# Programmers can't express invariants

Example: Ariana 501

<b>“Invariant”</b>	Casts from 64-bit floating point to 16-bit integers do not overflow (and are fast)
<b>Actually</b>	One did, involving position and acceleration
<b>Behavior</b>	

# Programmers can't express invariants

Example: Ariana 501

<b>“Invariant”</b>	Casts from 64-bit floating point to 16-bit integers do not overflow (and are fast)
<b>Actually</b>	One did, involving position and acceleration
<b>Behavior</b>	

# Programmers can't express invariants

Solutions:

- Types
- Formal methods
- Analyses

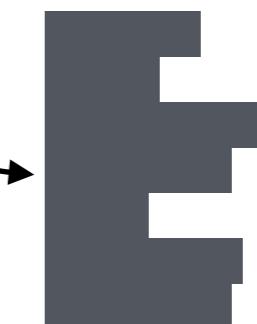
# Programmers can't express invariants

Solutions:

- Types
- Formal methods
- Analyses



Possible overflow



# Programmers can't express invariants

Solutions:

- Types
- Formal methods
- Analyses

```
newtype Newton_Seconds = Int  
newtype Pound_Force_Seconds = Int
```

```
impulse_calc : () -> Pound_Force_Seconds
```

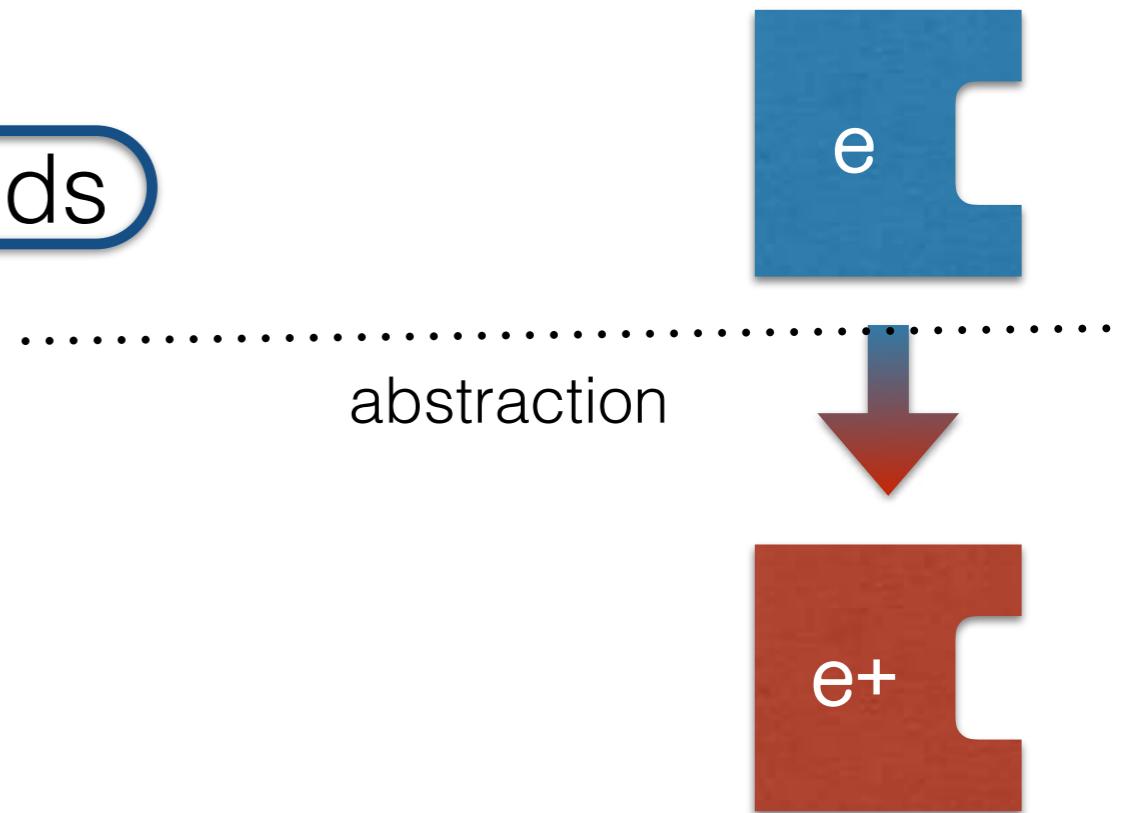
```
autopilot : Newton_Seconds -> ()
```

```
autopilot(impulse_calc()) -- Type error!
```

# Supposing we *can* express invariants

Definitely, for sure, absolutely holds

..... ➔ ✓ Happy source program



# Examples of Problem 2

Often,

1. Programmers can't express invariants

“invariant”:  
Belief or intent

2. Compilers don't respect invariants

In:

- Optimization
- Code generation

3. Linkers don't enforce invariants

On external code,  
violating intent

# Compilers don't respect invariants

Example: scrubbing secret memory

```
crypt(){  
    key = 0xC0DE; // read key  
    ... // work with the secure key  
    key = 0x0;     // scrub memory  
}
```

# Compilers don't respect invariants

Example: scrubbing secret memory

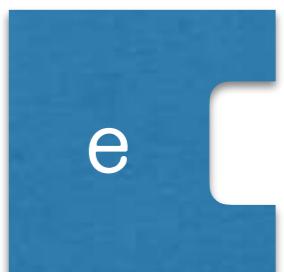
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```



```
crypt(){  
    key = 0xC0DE; // read key  
    ... // work with the secure key  
    .....  
}
```

.....

abstraction



e

e+

# Compilers don't respect invariants

Example: scrubbing secret memory

```
crypt(){  
    key = 0xC0DE; // read key  
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}
```

Performance invariant says this must go!

```
crypt(){  
    key = 0xC0DE; // read key  
    ... // work with the secure key  
}
```

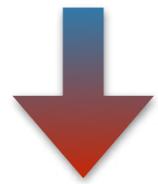
abstraction



# Compilers don't respect invariants

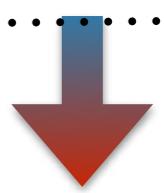
Example: scrubbing secret memory

```
crypt(){  
    volatile key = 0xC0DE; // read key  
    ... // work with the secure key  
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```

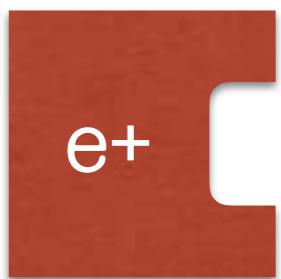


.....

abstraction



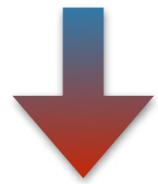
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# Compilers don't respect invariants

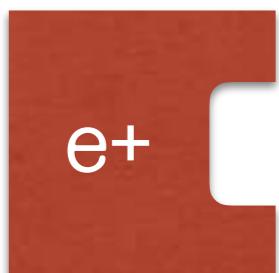
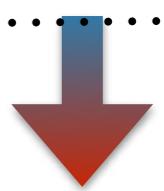
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.....

abstraction



```
crypt(){  
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# Compilers don't respect invariants

Example: scrubbing secret memory

**“Invariant”** volatile writes aren't optimized away

**Actually** Depends on the compiler

**Behavior** Undefined

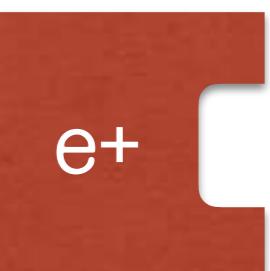
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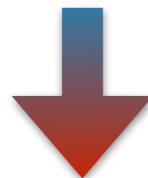
~~abstraction~~



# Compilers don't respect invariants

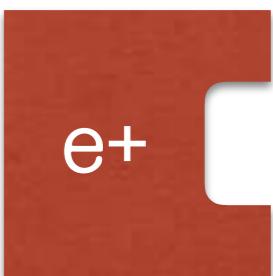
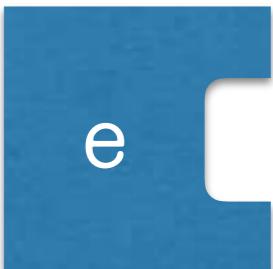
Example: floating point precision

$(10000001.0f * 10000001.0f) / 10000001.0f == 10000000.0f$



.....

abstraction



$10000001.0f * (10000001.0f / 10000001.0f) == 10000001.0f$

# Compilers don't respect invariants

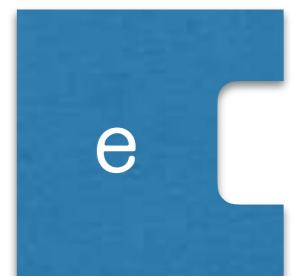
Example: floating point precision

“Invariant”	Compilation doesn't change floating point precision
Actually	Depends on the compiler, and the flags
Behavior	Undefined

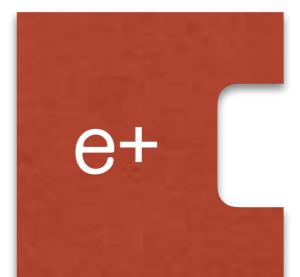
$(10000001.0f * 10000001.0f) / 10000001.0f == 10000000.0f$



.....  
abstraction



$10000001.0f * (10000001.0f / 10000001.0f) == 10000001.0f$



# Supposing we *can preserve* invariants

Definitely, for sure, absolutely holds



Definitely, for sure, still holds



abstraction

# Examples of Problem 3

Often,

1. Programmers can't express invariants

“invariant”:  
Belief or intent

2. Compilers don't respect invariants

In:

- Optimization
- Code generation

3. Linkers don't enforce invariants

On external code,  
violating intent

# Linkers don't enforce invariants

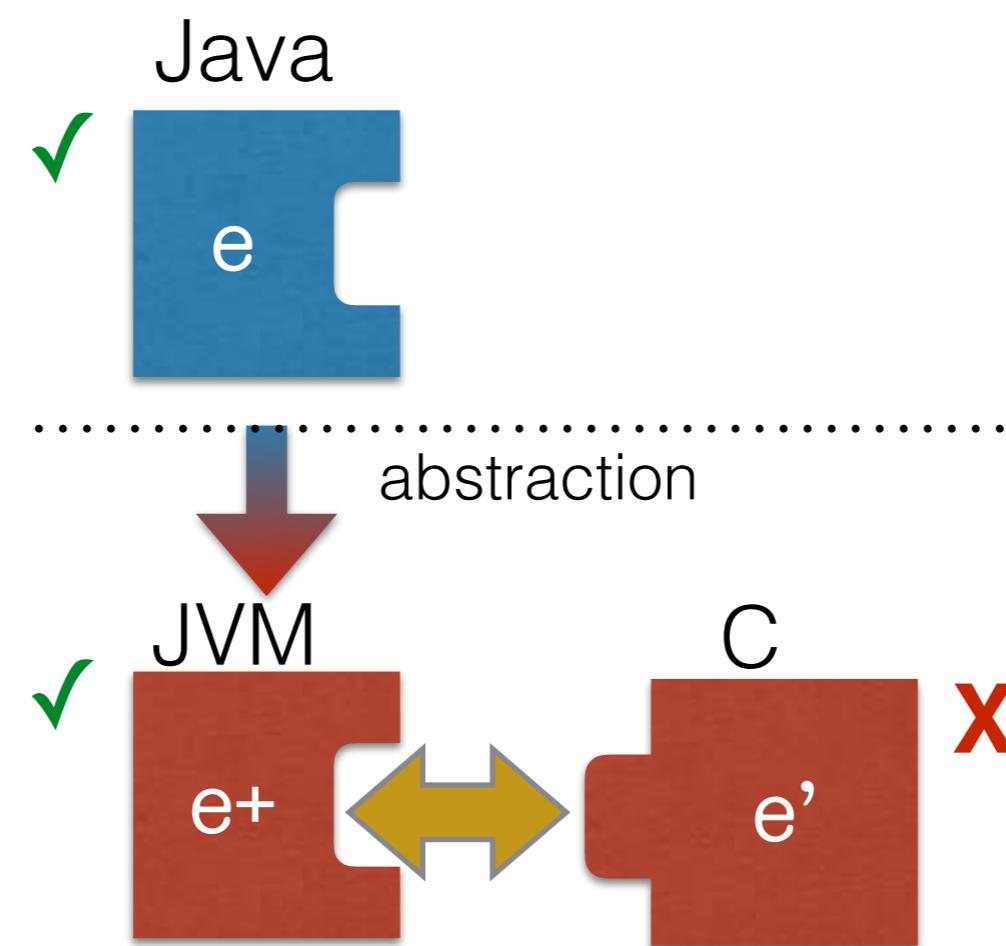
Example: Java isn't memory safe

<b>“Invariant”</b>
<b>Actually</b>
<b>Behavior</b>

All Java programs are memory safe

... unless you use the JNI to link with native code

Undefined



# Linkers don't enforce invariants

Example: Coq program goes wrong

Coq: proof assistant for writing high-assurance software  
with machine-checked proofs.

# Linkers don't enforce invariants

Example: Coq program goes wrong

Coq: proof assistant for writing high-assurance software  
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```
> coqc verified.v
> link verified.ml unverified.ml
> ocaml verified.ml
[1] 43185 segmentation fault (core dumped)
ocaml verified.ml
```

# Linkers don't enforce invariants

Example: Coq program goes wrong

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Example: Coq program goes wrong

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Example: Coq program goes wrong

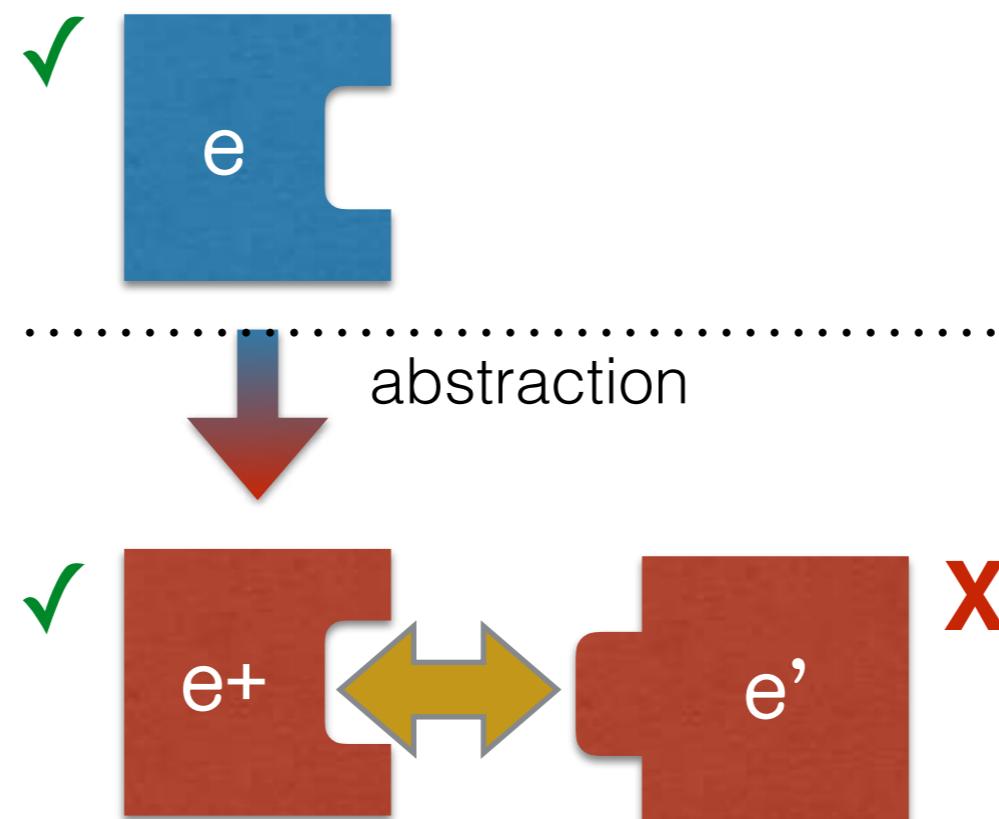
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# Linkers don't enforce invariants

Example: Coq program goes wrong

“Invariant”	Coq program verified to be free of out-of-bounds dereferences
Actually	... unless you link with anything
Behavior	Jumps to arbitrary location in memory



What is the behavior  
when an “invariant” isn’t?

What is the behavior  
when an “invariant” isn’t?

Bugs

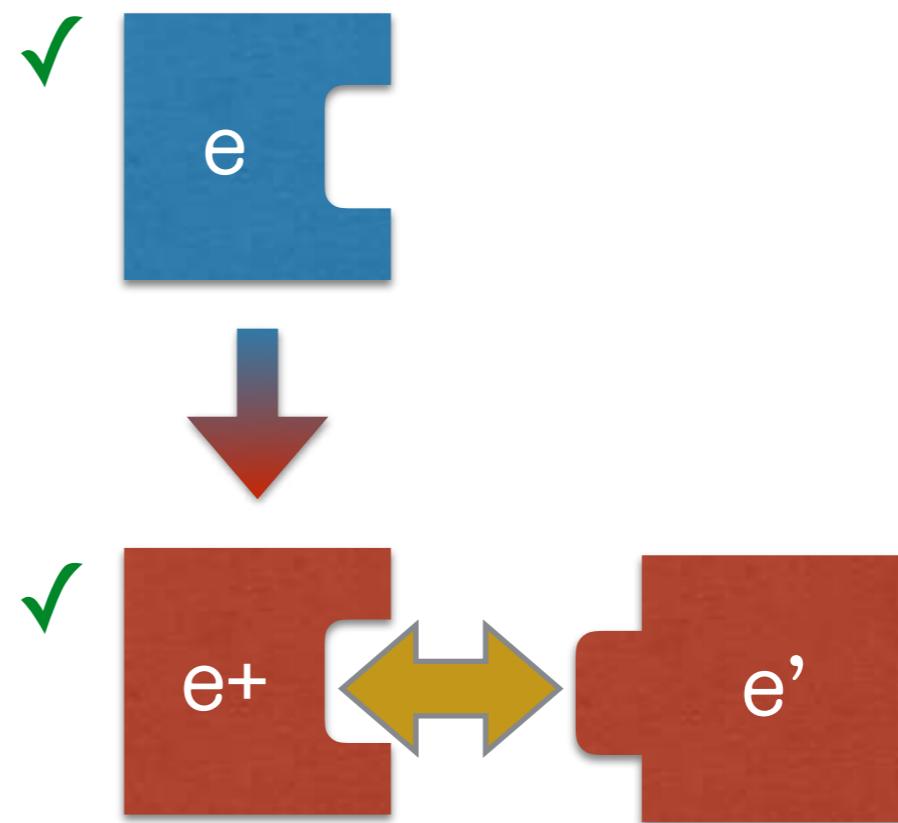
Security Attacks

Undefined Behavior

# Goal of my work

System for  
*expressing* invariant

Invariant-*respecting*  
(and *exploiting*)  
transformation

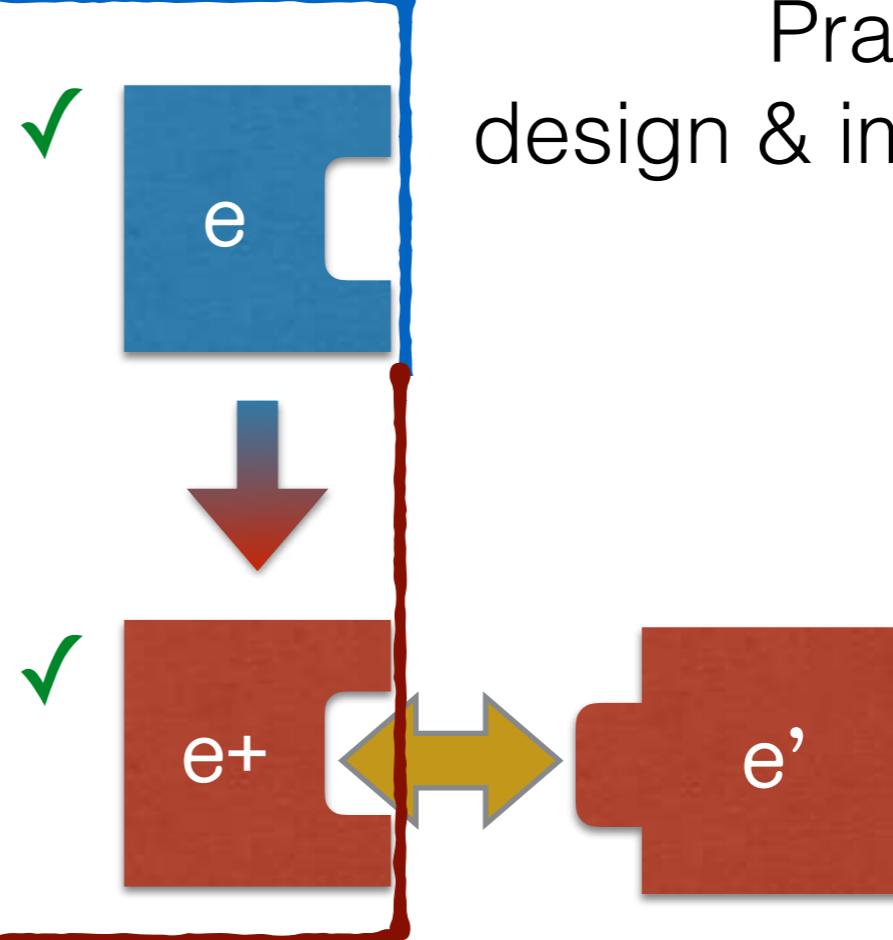


Invariant *enforcing*  
linking

# My work so far

System for  
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Invariant-*respecting*  
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Practical:  
design & implementation

Invariant *enforcing*  
linking

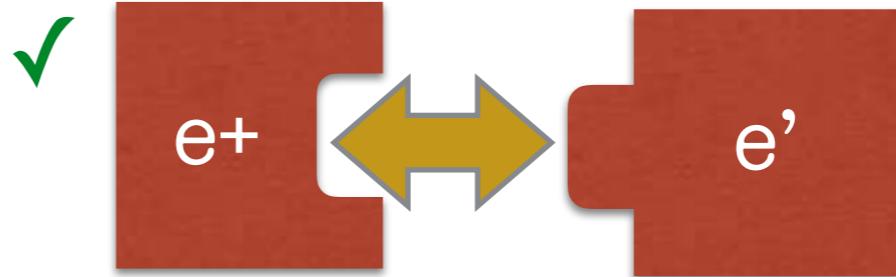
# My work so far

System for  
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Foundations:  
models & techniques

Invariant-*respecting*  
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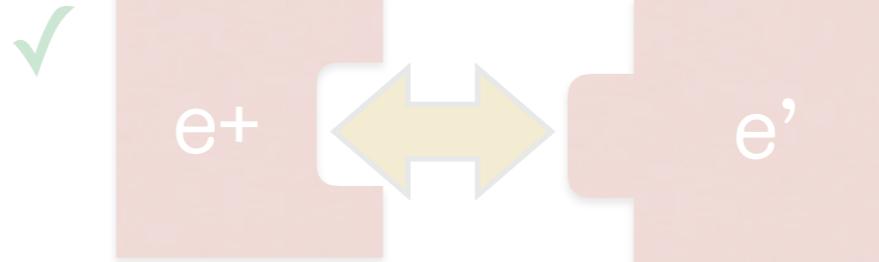
Invariant *enforcing*  
linking

# Building systems to express and exploit invariants:

How do we express and exploit domain-specific performance invariants?

Bowman, Miller, St-Amour, Dybvig. *Profile-Guided Meta-Programming*. PLDI 2015.

Invariant-preserving  
transformation



models and proofs

Linking cannot  
violate invariants

## Building systems to express and exploit invariants:

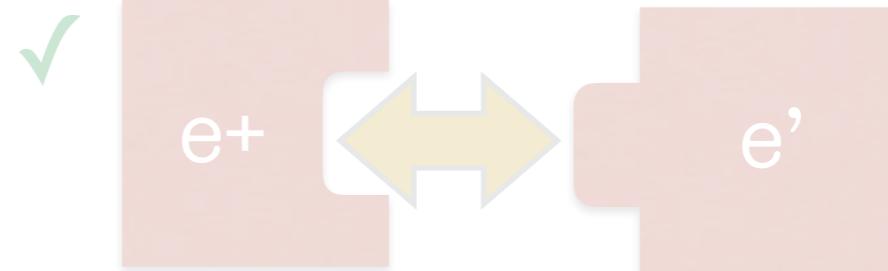
How do we express and exploit domain-specific performance invariants?

Bowman, Miller, St-Amour, Dybvig. *Profile-Guided Meta-Programming*. PLDI 2015.

How do we more easily express correctness/safety invariants and proofs?

Bowman. *Growing a Proof Assistant*. HOPE 2016.

Invariant-preserving  
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Linking cannot  
violate invariants

models and proofs

System for  
expressing invariant



Practical:  
design and impl.

Foundations for preserving and enforcing invariants:

System for  
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Practical:  
design and impl.

## Foundations for preserving and enforcing invariants:

How do we preserve and enforce *language-level invariants (language specs)*?

Bowman, Ahmed. *Noninterference for free*. ICFP 2015.

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New, Bowman, Ahmed. *Fully Abstract Compilation via Universal Embedding*. ICFP 2016.

How do we preserve and enforce *invariants encoded in dependent types*?

Bowman, Cong, Rioux, Ahmed. *Type-Preserving CPS ... is Not Possible*. POPL 2018.

Bowman, Ahmed. *Typed Closure Conversion for the Calculus of Constr*. PLDI 2018.

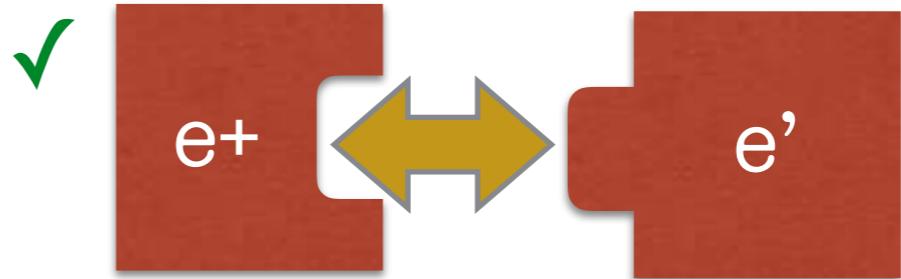
# Preserving and Enforcing Invariants

System for  
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Foundations:  
models & techniques

Invariant-*respecting*  
(and *exploiting*)  
transformation



Invariant *enforcing*  
linking

# Preserving Dependent Types

Dependent types



Coq

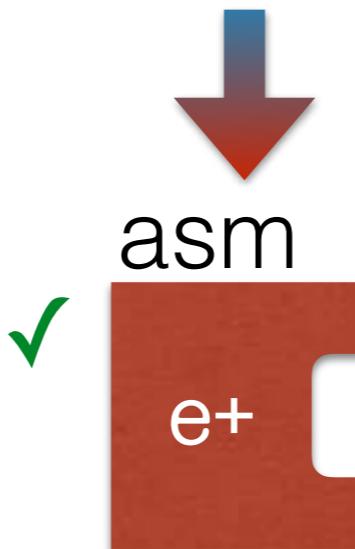
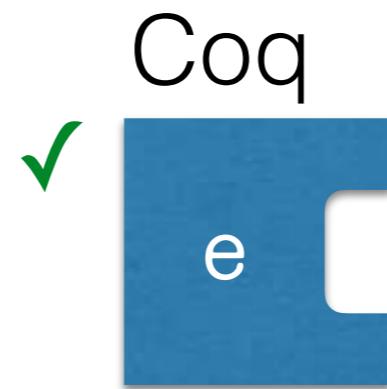


Invariants and proofs encoded  
in *dependent types*

# Preserving Dependent Types

Dependent types

Type-preserving compiler



Invariants and proofs encoded  
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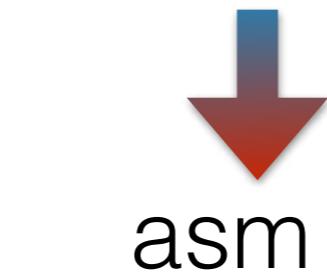
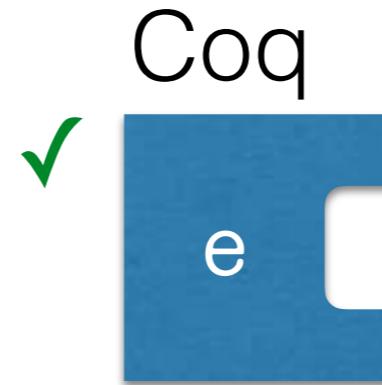
Invariants and proofs preserved

# Preserving Dependent Types

Dependent types

Type-preserving compiler

Safety and correctness invariant  
*enforced* at link time.



Invariants and proofs encoded  
in *dependent types*

Invariants and proofs preserved

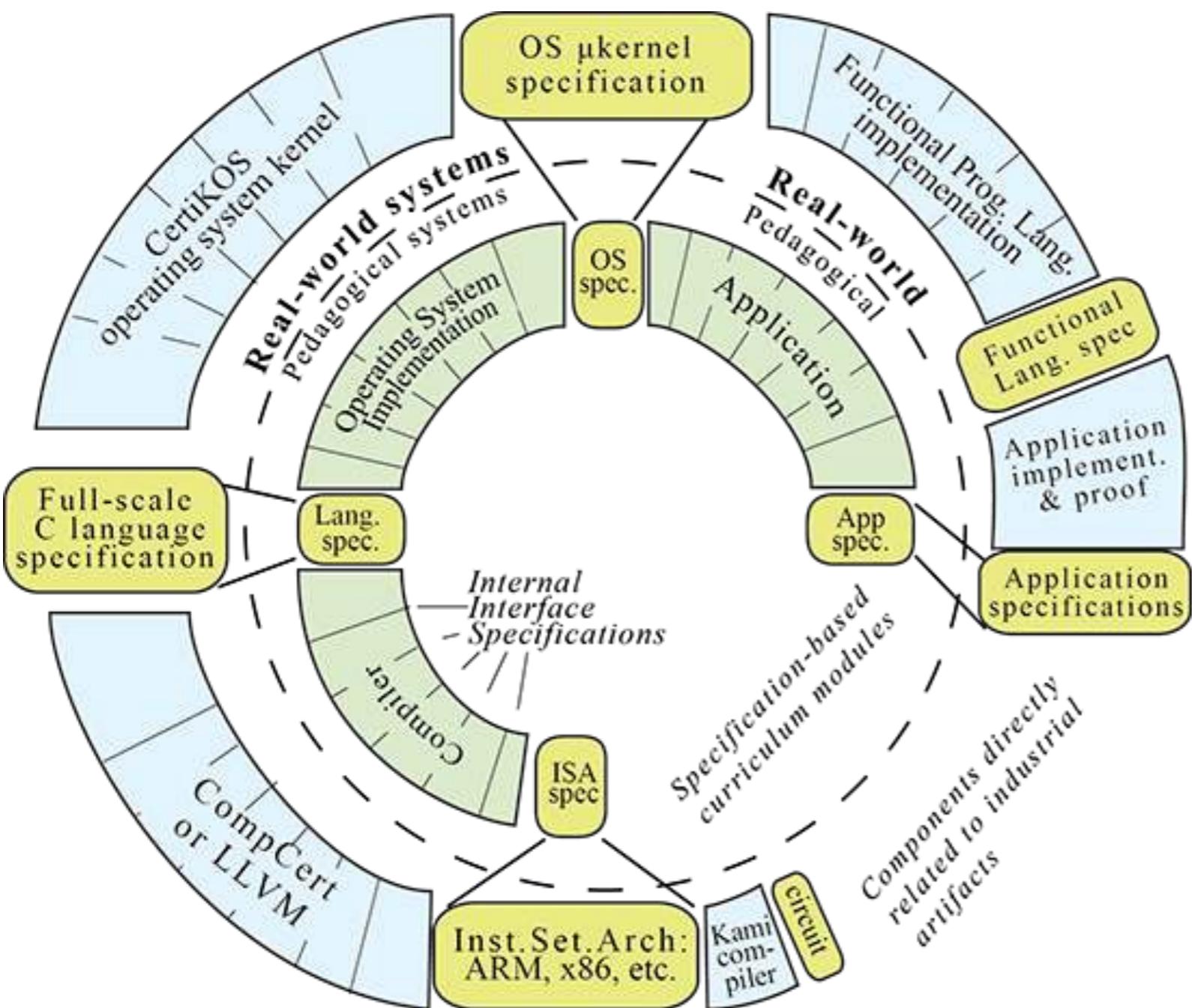
Type-checking at  
link time

# Why Coq and Dependent Types

## Verified in Coq!

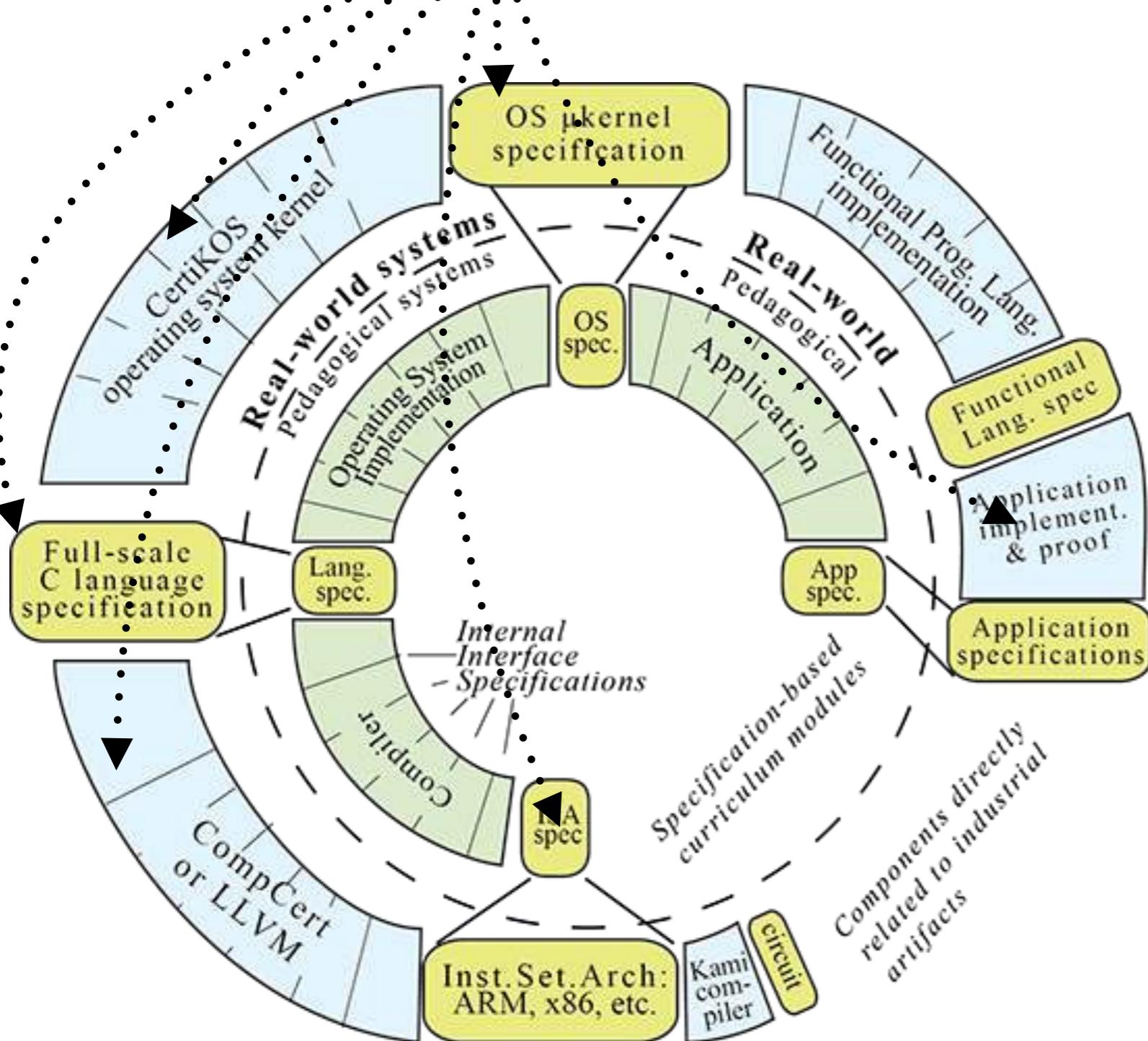
- CompCert
- CertiKOS
- Vellvm
- RustBelt
- CertiCrypt
- ...

# Why Coq and Dependent Types



An NSF Expedition

# Why Coq and Dependent Types



An NSF Expedition

... which heavily relies on Coq

# Why Coq and Dependent Types

Hope verified Coq programs can't go wrong...

```
> coqc verified.v
```

1 line file

```
> link verified.ml unverified.ml
```

```
> ocaml verified.ml
```

```
[1] 43185 segmentation fault (core dumped)  
ocaml verified.ml
```

# Encoding invariants in types

Simple types, simple invariants

5 : Int

/ : Int -> Int -> Int

10 / 5 : Int

# Encoding invariants in types

More type system features, the more we can encode.

```
newtype Newton_Seconds = Int
newtype Pound_Force_Seconds = Int

impulse_calc : () -> Pound_Force_Seconds

autopilot : Newton_Seconds -> ()

autopilot(impulse_calc()) -- Type error!
```

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```

# Encoding invariants in types

Dependent types = Types *depend on* terms

```
0 : Int
```

```
/ : y:Int -> x:{Int | x != 0} -> Int
```

```
10 / [5, 5 != 0] : Int
```

```
10 / [0, 0 != 0] -- Type error!
```

# Encoding invariants in types

Dependent types = Types *depend on* terms

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10 / [5, 5 != 0] : Int

10 / [0, 0 != 0] -- Type error!

# Encoding invariants in types

Dependent types = Types *depend on* terms

```
crypt : () -> () -- No guarantees
```

```
crypt : () -> {key : *Int | *key = 0x0}
-- Returns proof invariant was enforced
```

# Encoding invariants in types

Dependent types = Types *depend on* terms

**c\_compiler : C\_AST -> x86\_AST**

# Encoding invariants in types

Dependent types = Types *depend on* terms

**c\_compiler** : **C\_AST**  $\rightarrow$  **x86\_AST**

**c\_interp** : **C\_AST**  $\rightarrow$  **Int**

**x86\_interp** : **x86\_AST**  $\rightarrow$  **Int**

# Encoding invariants in types

Dependent types = Types *depend on* terms

`c_compiler : C_AST -> x86_AST`

`c_interp : C_AST -> Int`

`x86_interp : x86_AST -> Int`

`correct : x:C_AST ->`  
 `c_interp(x) = x86_interp(c_compile(x))`

# Encoding invariants in types

Dependent types = Types *depend on* terms

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Dependent types = Types *depend on* terms

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# Checking dependent types

- Write programs that express proofs

```
c_compiler : C_AST -> x86_AST
```

```
c_interp : C_AST -> Int
```

```
x86_interp : x86_AST -> Int
```

```
correct : x:C_AST ->
          c_interp(x) = x86_interp(c_compile(x))
```

# Checking dependent types

- Write programs that express proofs
- Refer to code in types

```
c_compiler : C_AST -> x86_AST
```

```
c_interp : C_AST -> Int
```

```
x86_interp : x86_AST -> Int
```

```
correct : x:C_AST ->
          c_interp(x) = x86_interp(c_compile(x))
```

# Checking dependent types

- Write programs that express proofs
- Refer to code in types
- Decide equality between programs

`c_compiler : C_AST -> x86_AST`

`c_interp : C_AST -> Int`

`x86_interp : x86_AST -> Int`

`correct : x:C_AST ->`  
 `c_interp(x) = x86_interp(c_compile(x))`

# A type-preserving compiler

Dependent types



Type-preserving  
compiler

Make title case consistent



# A type-preserving compiler



CPS: Make control flow explicit



CC: Make data flow explicit



Alloc: Make allocation explicit



Code gen: Generate assembly code



Morrisett, Walker, Crary, Glew 1998

# A type-preserving compiler

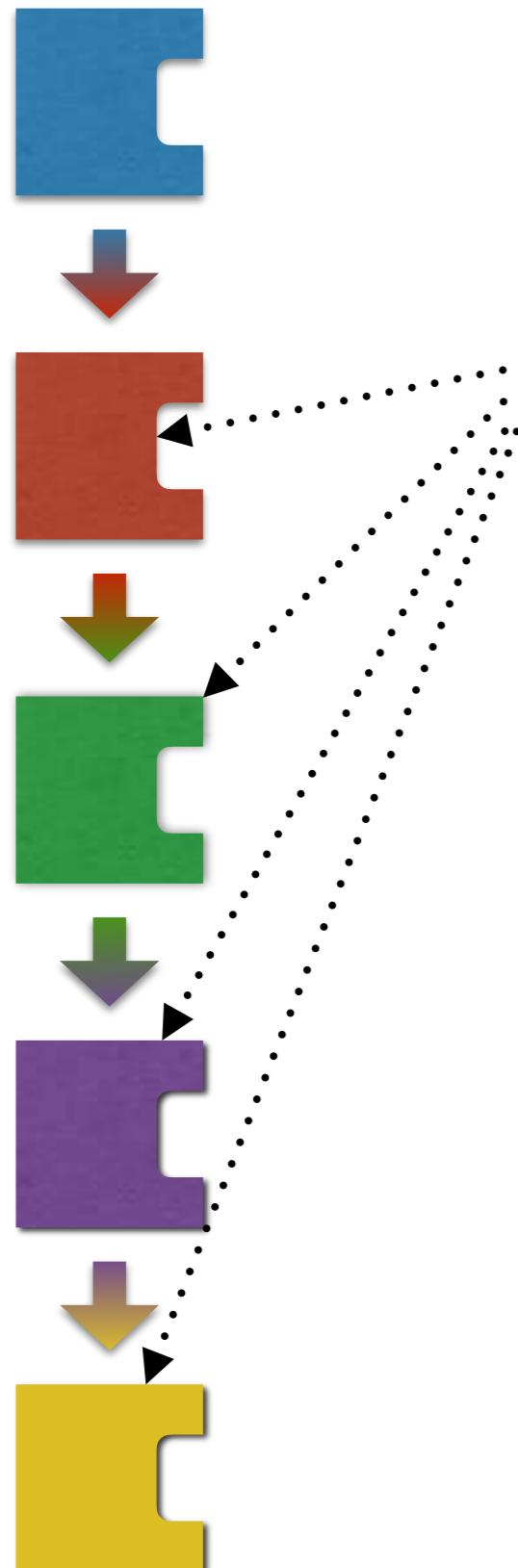


Theorem. (Type Preservation)

If  $e : A$   
then  $e^+ : A^+$  translates to

⋮

# A type-preserving compiler



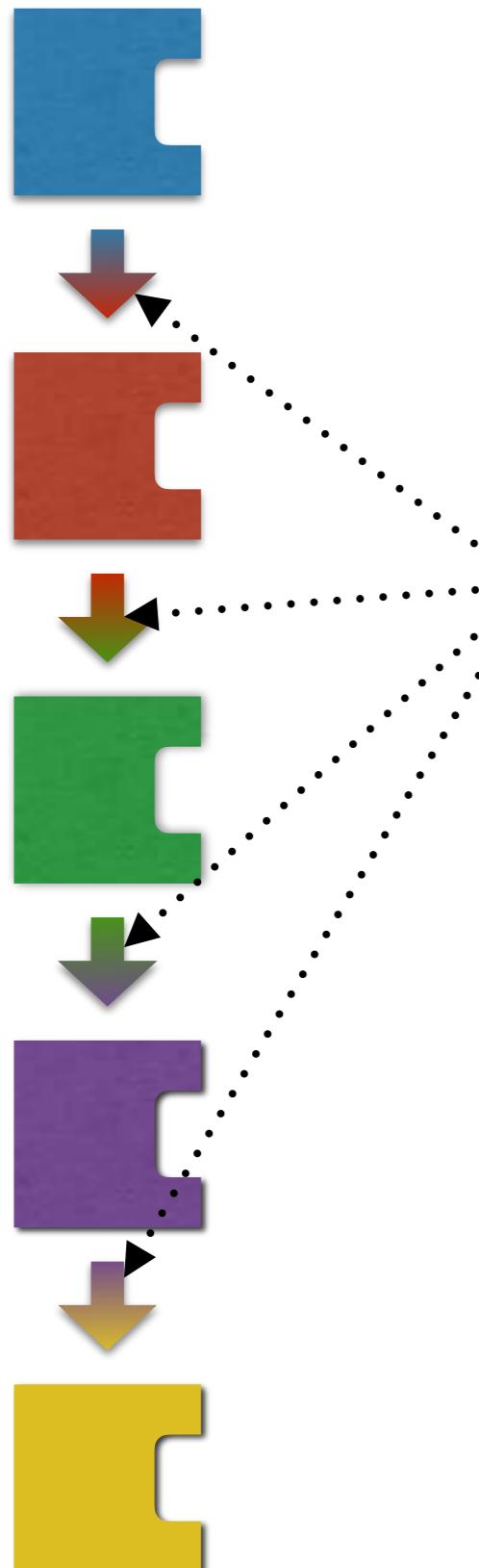
# A type-preserving compiler



Hard to design for low-level languages  
With *dep. types*, hard to prove sound

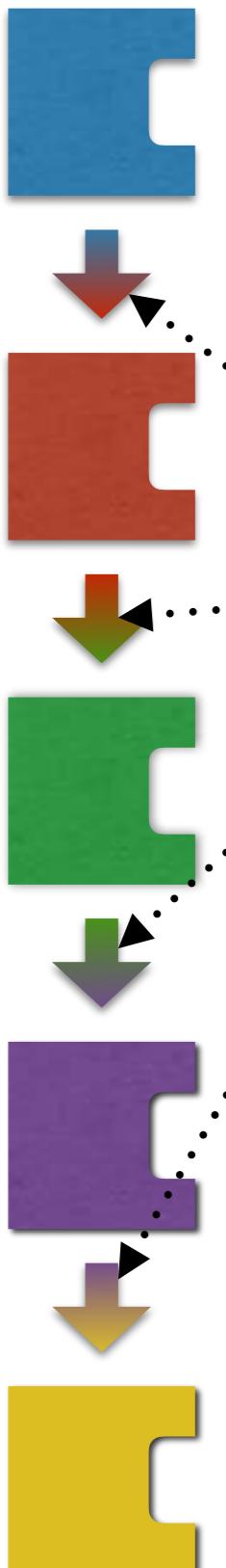
1. Design typed intermediate language  
Prove soundness, decidability, etc

# A type-preserving compiler



1. Design typed intermediate language  
Prove soundness, decidability, etc
2. Adapt standard translation  
Prove correctness, preservation, etc

# A type-preserving compiler



*With dep. types, hard to transform proofs*

1. Design typed intermediate language  
Prove soundness, decidability, etc
2. Adapt standard translation  
Prove correctness, preservation, etc

Theorem. (Type Preservation)

Contains proofs

$e : A$

then

$e^+ : A^+$

translates to

# Brief history of preserving *simple* types



CPS: Make control flow explicit



CC: Make data flow explicit



Alloc: Make allocation explicit



Code gen: Generate assembly code



# Brief history of preserving *simple* types



CPS: Make control flow explicit

1985



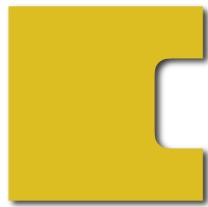
CC: Make data flow explicit



Alloc: Make allocation explicit



Code gen: Generate assembly code

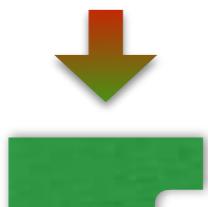


# Brief history of preserving *simple* types



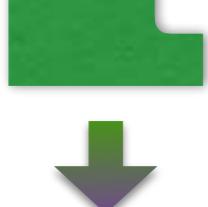
CPS: Make control flow explicit

1985



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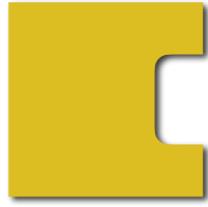
1996



Alloc: Make allocation explicit



Code gen: Generate assembly code

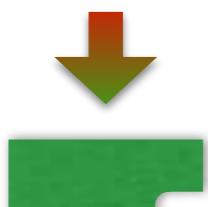


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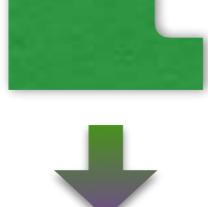
CPS: Make control flow explicit

1985



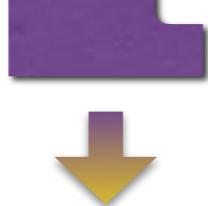
CC: Make data flow explicit

1996



Alloc: Make allocation explicit

1998



Code gen: Generate assembly code

1998

# Brief history of preserving *simple* types



Applications in *secure* compilation



CPS: Make control flow explicit

1985

2015



CC: Make data flow explicit

1996

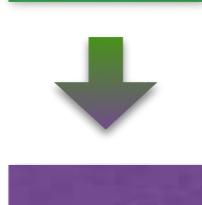
2016



Alloc: Make allocation explicit

1998

On-going



Code gen: Generate assembly code

1998

On-going

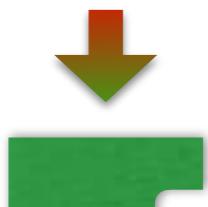


# Brief history of preserving *dependent* types

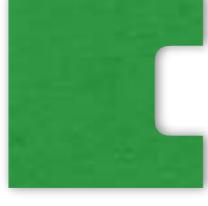


CPS: Make control flow explicit

1999, 2002



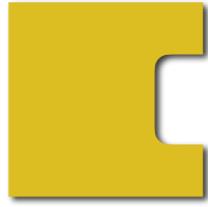
CC: Make data flow explicit



Alloc: Make allocation explicit



Code gen: Generate assembly code



# Brief history of preserving *dependent* types



CPS: Make control flow explicit

1999, 2002 ←.....

Impossibility result.



CC: Make data flow explicit



Alloc: Make allocation explicit



Code gen: Generate assembly code

# Brief history of preserving *dependent* types



CPS: Make control flow explicit

1999, 2002      POPL 2018  
                    Bowman, Cong, Rioux, Ahmed



CC: Make data flow explicit



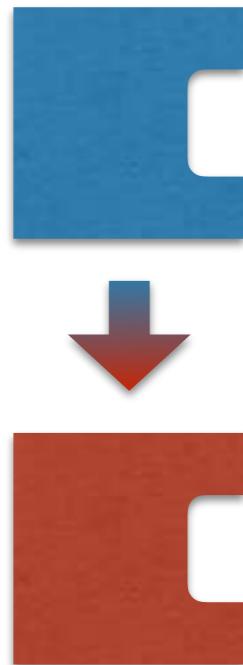
Alloc: Make allocation explicit



Code gen: Generate assembly code



# CPS for Dependent Types



POPL 2018  
Bowman, Cong, Rioux, Ahmed

# CPS: Continuation-Passing Style

Makes control flow explicit in syntax.

Equivalent to:

- CFGs
- SSA

# CPS: Continuation-Passing Style

```
function f(x) { ... }  
f(e)  
~>
```

# CPS: Continuation-Passing Style

Function f is now a labeled block

```
function f(x) { ... }
f(e)
~>
f : ...+
l1: k = l2; e+
l2: x = r; goto f
```

# CPS: Continuation-Passing Style

```
function f(x) { ... }  
f(e)  
~>  
f : ...+  
11: k = 12; e+  
12: x = r; goto f
```

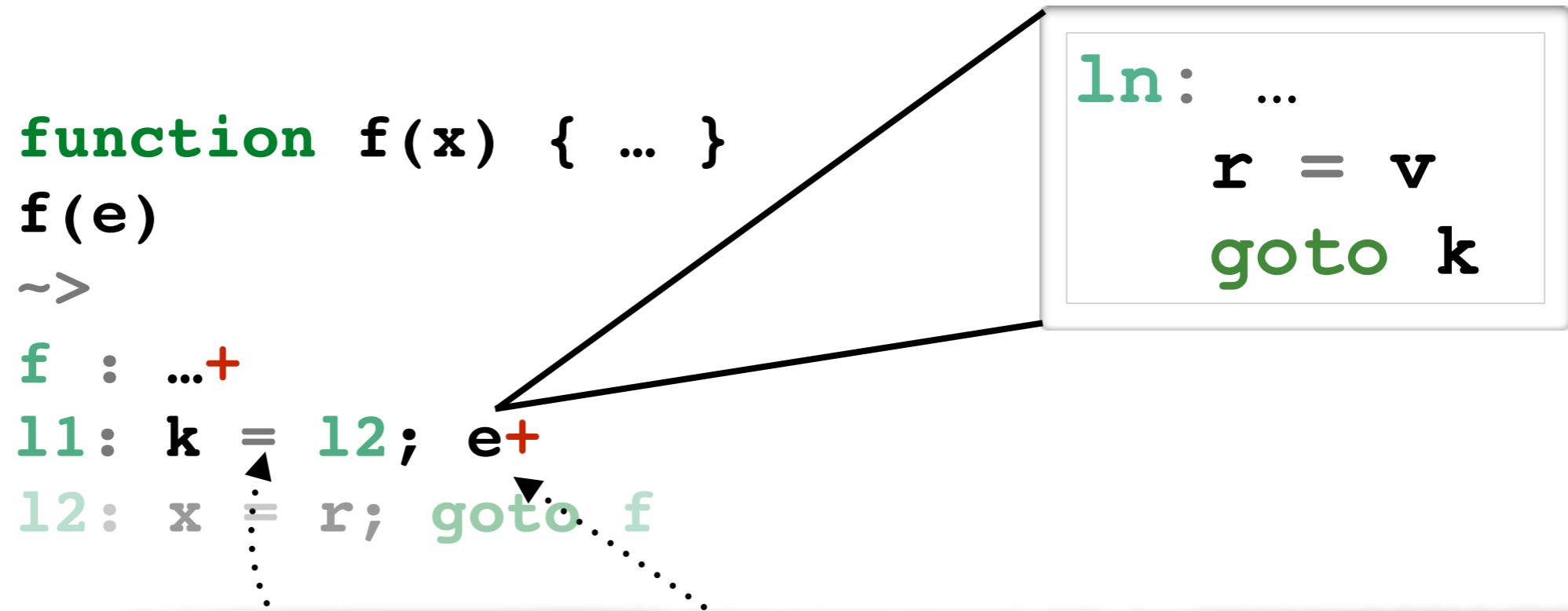
+ means, recursively translate

# CPS: Continuation-Passing Style

```
function f(x) { ... }
f(e)
~>
f : ...
11: k = 12; e+
12: x = r; goto f
    . . .
```

Setup calling conventions:  
When **e+** is finished, store result in **r**, **goto k**

# CPS: Continuation-Passing Style



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function f(x) { ... }
f(e)
~>
f : ...+
l1: k = l2; e+
l2: x = r; goto f
```

# CPS: Continuation-Passing Style

A few more technical details

```
function f(x) { ... }

f(e)
~>      :..... In main, initialize k to special halt
          :
f    : ...+ ↓
main: k = halt; goto l1
l1  : k1 = k; k = l2; e+
l2  : k = k1; x = r; goto f;
```

# CPS: Continuation-Passing Style

A few more technical details

```
function f(x) { ... }

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~>
f : ...+ .....  
main: k = halt; goto l1
l1 : k1 = k;   k = l2; e+
l2 : k = k1;   x = r; goto f;
```

Save/restore “continuation”  
around translated subexprs

# CPS: Continuation-Passing Style

A few more technical details

```
function f(x) { ... }

f(e)
~>

f : ...+
main: k = halt; goto l1
l1 : k1 = k; k = l2; e+
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# CPS: Continuation-Passing Style

```
5
~>
main: k = halt; goto 11
11  : r = 5; goto k
```

# CPS: Continuation-Passing Style

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~>
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# CPS: Continuation-Passing Style

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...
x
~>
main: k = halt; goto l1
l1 : k1 = k; k = l2; ...+
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# CPS: Continuation-Passing Style

```
...
x
~>
main: k = halt; goto 11
11  : k1 = k; k = 12; ...+
12  : k = k1; r = x; goto k
```

# CPS: Continuation-Passing Style

From now on, ignoring `main` and save/restore

```
[e1, e2]
~>
l1: k = l2; e1+
l2: x1 = r; k = l3; e2+
l3: x2 = r; r = [x1, x2]
```

# CPS: Continuation-Passing Style

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l1: k = l2; e1+
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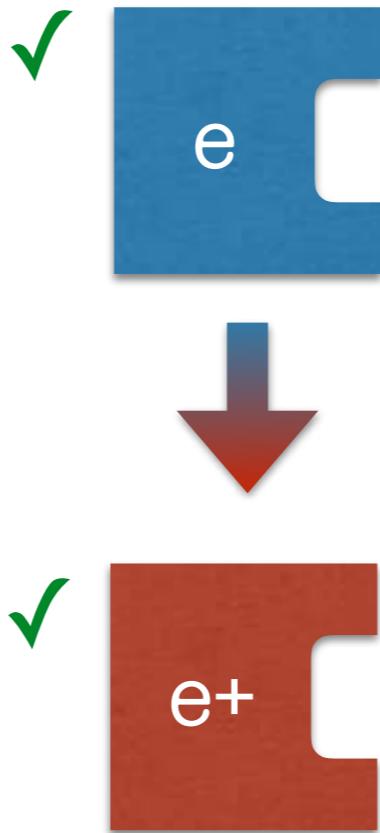
# CPS: Continuation-Passing Style

From now on, ignoring `main` and save/restore

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[e1, e2]
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l1: k = l2; e1+
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```

# Why would CPS be hard?

Invariants about programs ✓  
with call/return

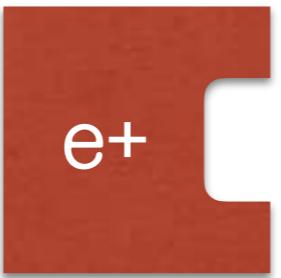


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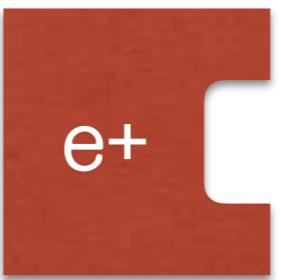


Invariants about programs ✓  
with **goto**



# Why would CPS be hard?

Invariants about programs ✓  
with call/return



Invariants about programs ✓  
with **goto**

Must design type  
system to reason  
about **goto**

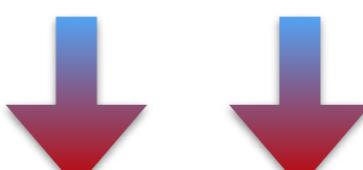
# Goal: *Type-preserving* CPS translation

Theorem. (Type Preservation)

If

$$e : A$$

then



translates to

$$e^+ : A^+$$

Goal: *Type-preserving* CPS translation

Problem:  $\Sigma$  *types* (strong dependent pairs)

$$\frac{\mathbf{p} : \{ \mathbf{x} : \mathbf{A} \mid \mathbf{B} \}}{\mathbf{snd(p)} : \mathbf{B}[\mathbf{x} \mapsto \mathbf{fst(p)}]}$$

**p** is pair of an **A** and a **B**

$$\frac{\mathbf{p} : \{ \mathbf{x} : \mathbf{A} \mid \mathbf{B} \}}{\mathbf{snd(p)} : \mathbf{B}[\mathbf{x} \mapsto \mathbf{fst(p)}]}$$

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where

**B** (a type) can refer to

**x** (a program var. that stands for **fst(p)**)

**p** is pair of an **A** and a **B**

$$\frac{p : \{x : A \mid B\}}{\text{snd}(p) : B[x \mapsto \text{fst}(p)]}$$

where

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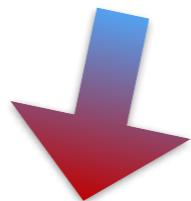
11: **k** = 12; **p+**

12: **x** = **r**; **r** =  **snd(x)**

# Goal: *Type-preserving* CPS translation

$$\frac{p : \{x : A \mid B\}}{\text{snd}(p) : B[x \mapsto \text{fst}(p)]}$$

Need:



11:  $k = 12; p+$

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# Goal: *Type-preserving* CPS translation

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Have:

11:  $k = 12; p+$

12:  $x = r; r = \text{snd}(x) : B+[x \mapsto \text{fst}(x)]$

Goal: *Type-preserving* CPS translation

Suffices:

$$(\mathbf{fst}(\mathbf{p}))^+ = \mathbf{fst}(\mathbf{x})$$

$$\frac{\mathbf{p} : \{ \mathbf{x} : \mathbf{A} \mid \mathbf{B} \}}{\mathbf{snd}(\mathbf{p}) : \mathbf{B}[\mathbf{x} \mapsto \mathbf{fst}(\mathbf{p})]}$$

Need:

$$11: \mathbf{k} = \mathbf{l2}; \mathbf{p}^+$$

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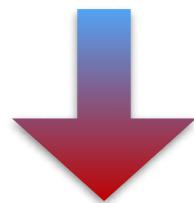
Suffices:

$(\text{fst}(p))^+ = \text{fst}(x)$

Suffices:

(**fst(p)**)<sup>+</sup>

(**fst(p)**)<sup>+</sup> = **fst(x)**



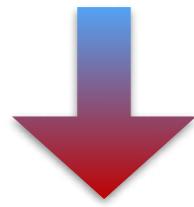
11: k = 12; p<sup>+</sup>

12: y = r; r = **fst(y)**

Suffices:

$(\text{fst}(p))^+ = \text{fst}(x)$

$(\text{fst}(p))^+$



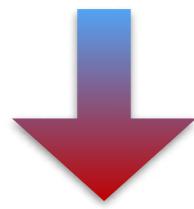
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11: k = 12; p+
12: y = r; r = fst(y)
```

```
ln: ...
    r = v
    goto k
```

Suffices:

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$(\text{fst}(p))^+$



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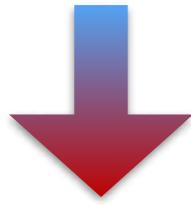
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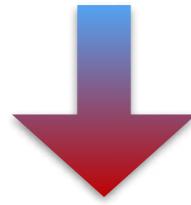
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But remember, this is *intuitive*;  
no external code/separate compilation

Suffices:

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$$x = \text{value-of}(p^+)$$

But remember, this is *intuitive*;  
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Impossibility result.

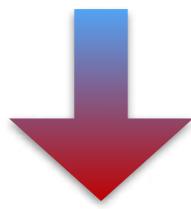
In *standard* CPS, can prove

$$x \neq \text{value-of}(p^+)$$

Suffices:

$$(\text{fst}(p))^+ = \text{fst}(x)$$

(**fst(p)**)<sup>+</sup>



```
11: k = 12; p+
12: y = r; r = fst(y)
```

```
ln: ...
r = v
goto k
```

Impossibility Proof.

If ... can use arbitrary **goto**,  
this program can do anything.

Suffices:

$$x = \text{value-of}(p^+)$$

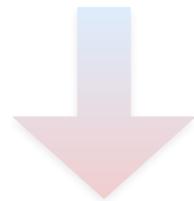
If we try to admit this equality, type  
system must be inconsistent.

In implicit invariant  
to the rescue

Suffices:

$$(\text{fst}(p))^+ = \text{fst}(x)$$

(**fst(p)**)<sup>+</sup>



```
11: k = 12; p+
12: y = 1
```

Theorem was misunderstood as:  
In *every* CPS translation ...  
Hence this is impossible.



$$x = \text{value-of}(p^+)$$

But remember, this is *intuitive*;  
no external code/separate compilation

Impossibility result.

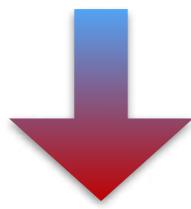
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Suffices:

$$x = \text{value-of}(p^+)$$

If we try to admit this equality, type  
system must be inconsistent.

# Solution

Suffices:

$x = \text{value-of}(p^+)$

Non-standard, but  
same control-flow properties



$p^+ : \text{Definitely jumps to } 12$

$x = \text{value-of}(p^+) \vdash e : B$

---

$11: k = 12; p^+$

$12: x = r; r = e : B$

# Solution

Suffices:

$x = \text{value-of}(p^+)$

If we can prove this invariant

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If we can prove this invariant

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---

$11: k = 12; p^+$

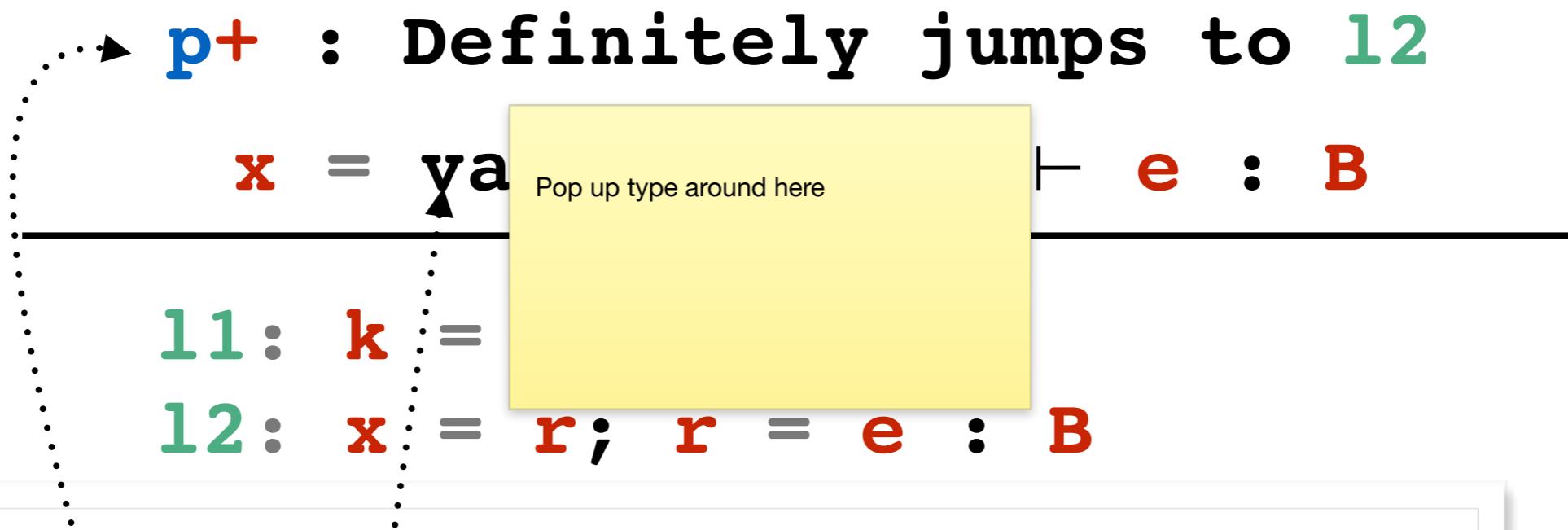
$12: x = r; r = e : B$

Then it's safe to assume this equality

# Solution

Suffices:

$x = \text{value-of}(p^+)$



Develop proof system for this  
Develop value interpretation of code with **goto**  
Prove type system consistent

# Closure Conversion for Dependent Types



PLDI 2018  
Bowman, Ahmed

# Closure Conversion for Dependent Types

```
...
function f(x) {
    return function (y) {
        return x + y;
    }
}
f(a)(b)
```



Turn higher-order functions

# Closure Conversion for Dependent Types

```
...
function f(x){  
    return function (y) {  
        return x + y;  
    }  
}  
f(a)(b)
```



Turn higher-order functions

# Closure Conversion for Dependent Types

```
...
function f(x) {
    return function (y) {
        return x + y;
    }
}
f(a)(b)
```



```
...
function f(x) {
    return [x, g];
}

function g(x, y) {
    return x + y;
}
c = f(a)
c[2](c[1], b)
```

Turn higher-order functions  
into

“objects” (closures)

# Closure Conversion for Dependent Types

```
...
function f(x) {
    return function (y) {
        return x + y;
    }
}
f(a)(b)
```



Turn higher-order functions

into

“objects” (closures)

```
...
function f(x) {
    return [x, g];
}
```

```
function g(x, y) {
    return x + y;
}
```

```
c = f(a)
c[2](c[1], b)
```

# Closure Conversion for Dependent Types

```
...
function f(x) {
    return function (y) {
        return x + y;
    }
}
f(a)(b)
```



```
...
function f(x) {
    return [x, g];
}

function g(x, y) {
    return x + y;
}

c = f(a)
c[2](c[1], b)
```

Turn higher-order functions  
into

“objects” (closures)

1. Decide closure equivalence
2. Transform local proofs into global

# X Translation for Dependent Types



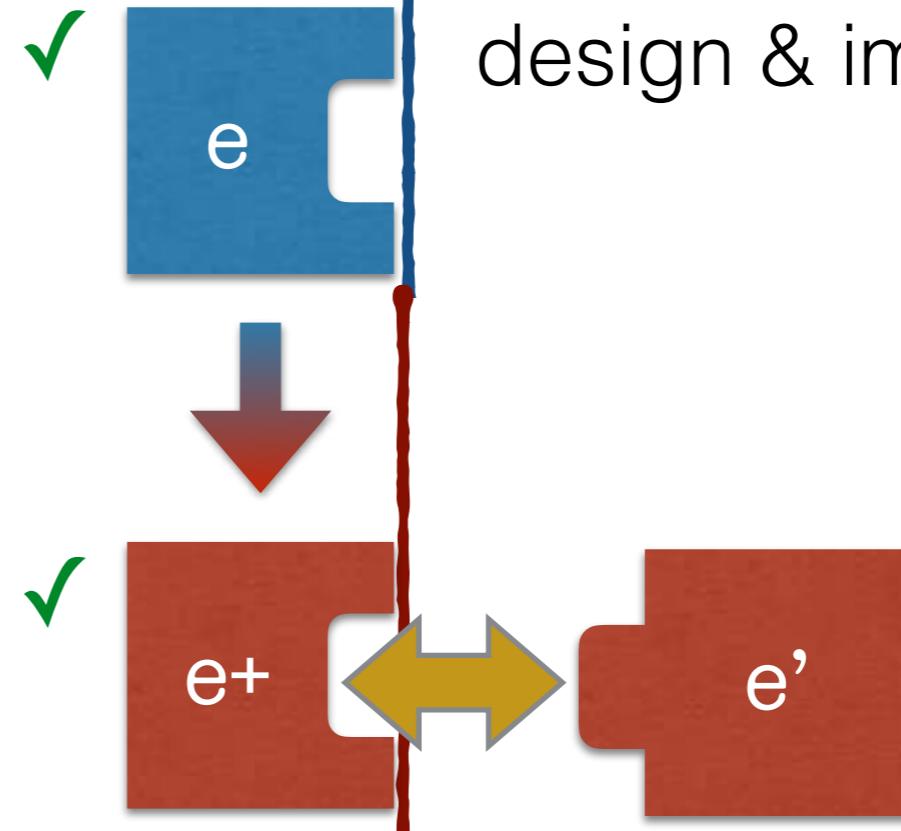
1. Decide X equivalence
2. Transform implicit invariants  
into explicit invariants

# Expressing and Exploiting Invariants

System for  
*expressing* invariant

Invariant-*respecting*  
(and *exploiting*)  
transformation

Practical:  
design & implementation



Invariant *enforcing*  
linking

# Profile-Guided Optimization for DSLs

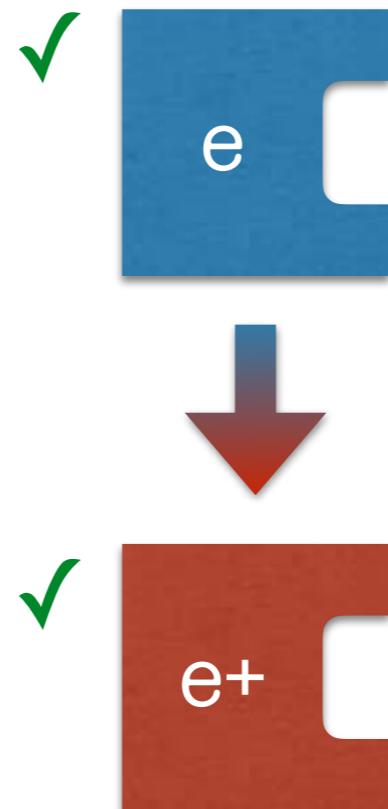
Domain-specific  
languages



# Profile-Guided Optimization for DSLs

Domain-specific  
languages

Optimizing (invariant  
exploiting) compiler



# Expressing Invariants in DSLs

Suppose you have a pattern when working in some domain

```
if f(e) {  
    ...  
} else if g(e) {  
    ...  
} else if h(e) {  
    ...  
}
```

# Expressing Invariants in DSLs

Maybe you have a lot of such patterns



```
if f(e) {  
    ...  
} else if g(e) {  
    ...  
} else if h(e) {  
    ...  
}  
  
function (k) {  
    ... (function (x) {  
        ... x k  
    })  
}
```



```
for (i = 0; i < n; i++){  
    f(a[i])  
}
```

# Expressing Invariants in DSLs

You could create abstractions in a general-purpose lang.

```
function discriminate(e) {  
    if f(e) {  
        ...  
    } else if g(e) {  
        ...  
    } else if h(e) {  
        ...  
    }  
}
```

# Expressing Invariants in DSLs

But maybe in your domain, you know more

```
function discriminate(e) {
```

```
    if f(e) {
```

e must have certain structure

```
    ...
```

```
    } else if g(e) {
```

```
    ...
```

```
    } else if h(e) {
```

```
    ...
```

```
}
```

f(e), g(e), h(e) mutually exclusive

```
}
```

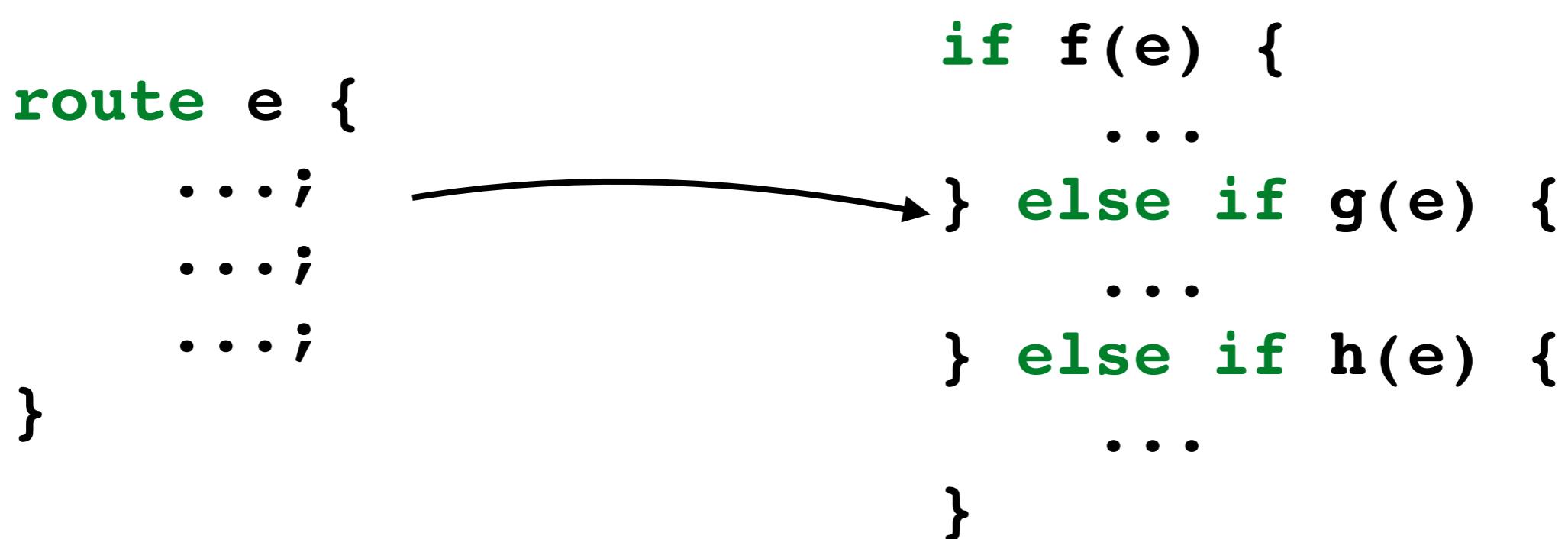
# Expressing Invariants in DSLs

So, you make a new DSL to enforce those invariants

```
route e {  
    ...;  
    ...;  
    ...;  
}  
    checks that e is valid at compile-time  
    knows mutually exclusive
```

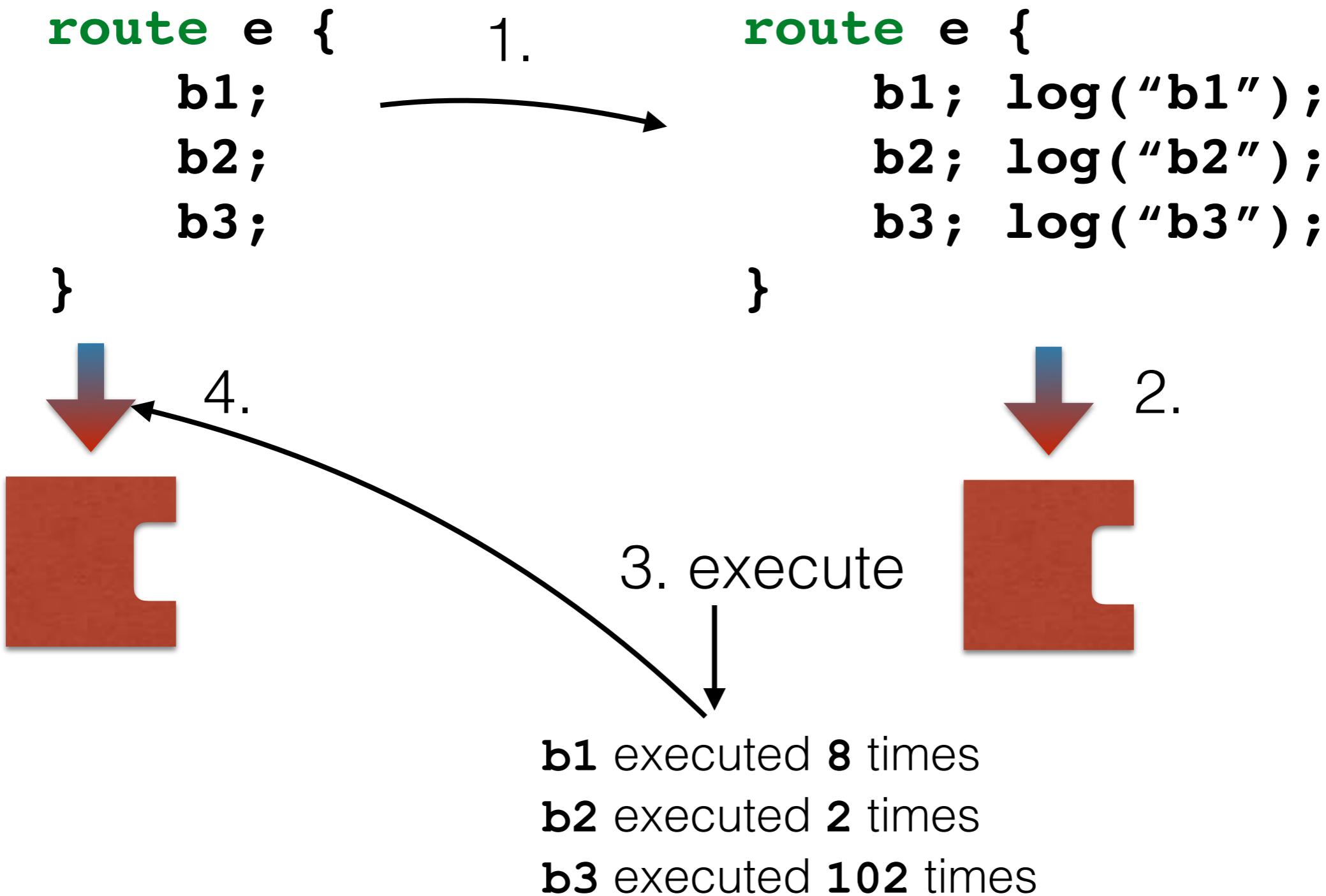
# Expressing Invariants in DSLs

Compile to some general-purpose language



And invariants are lost, can't be used for optimization

# Profile-Guided Optimization



# Profile-Guided Optimization

```
route e {  
    b1;  
    b2;  
    b3;  
}
```

1.

```
route e {  
    b1; log("b1");  
    b2; log("b2");  
    b3; log("b3");  
}
```

But! PGO can't use domain invariants  
(... unless you implement the compiler toolchain yourself)

3. execute

b1 executed 8 times  
b2 executed 2 times  
b3 executed 102 times

# Profile-Guided Optimization

```
route e {  
    b1;  
    b2;  
    b3;  
}
```

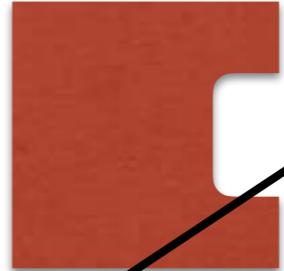
1.

```
if f(e) {  
    b1;  
} else if g(e) {  
    b2;  
} else if h(e) {  
    b3;  
}
```

2.

4.

3. execute



b1 executed **8** times

b2 executed **2** times

b3 executed **102** times

# Profile-Guided Meta-Programming

PLDI 2015

Bowman, Miller, St-Amour, Dybvig.

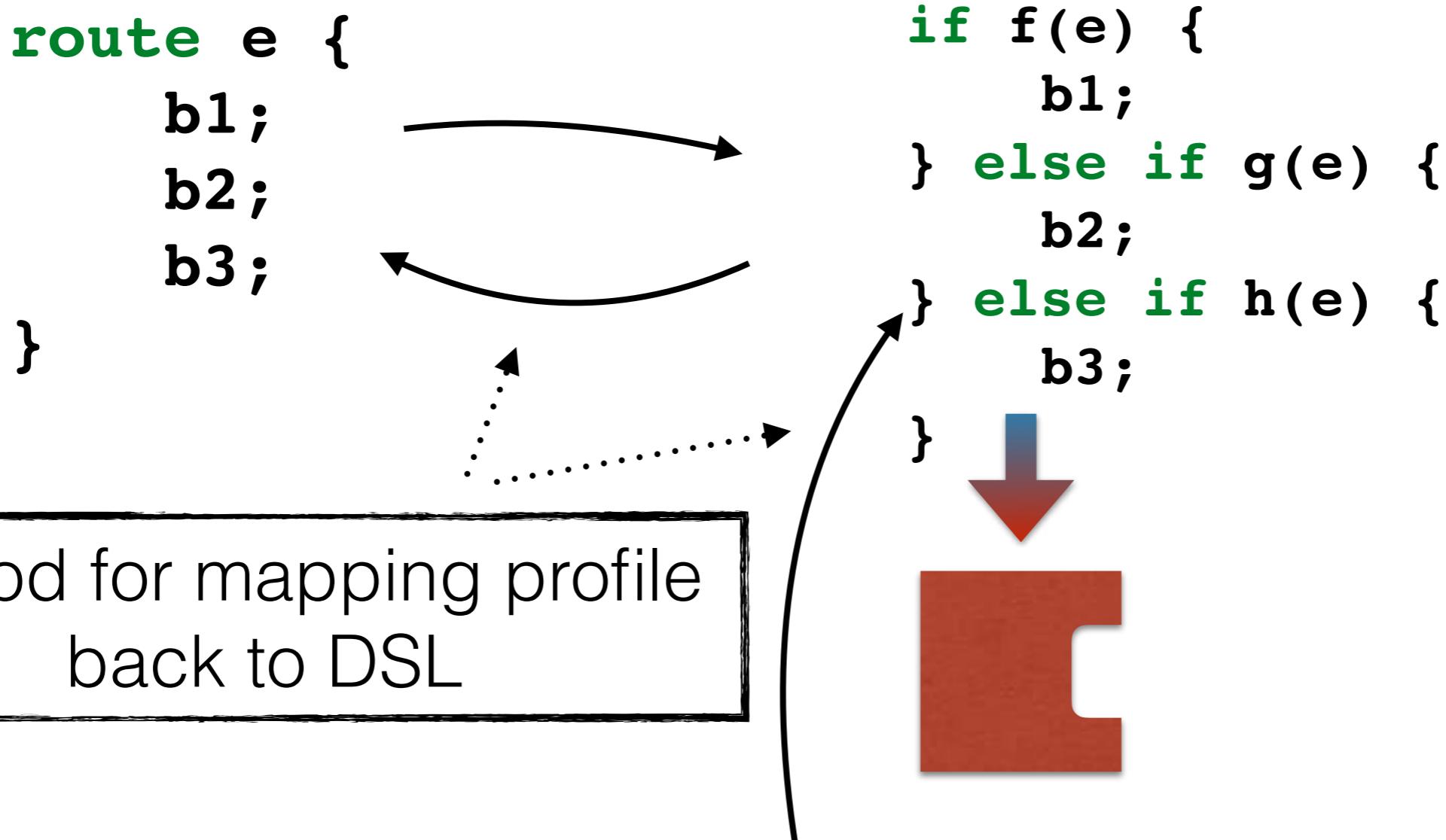
# Profile-Guided Meta-Programming

```
route e {  
    b1;  
    b2;  
    b3;  
}
```

```
if f(e) {  
    b1;  
} else if g(e) {  
    b2;  
} else if h(e) {  
    b3;  
}
```

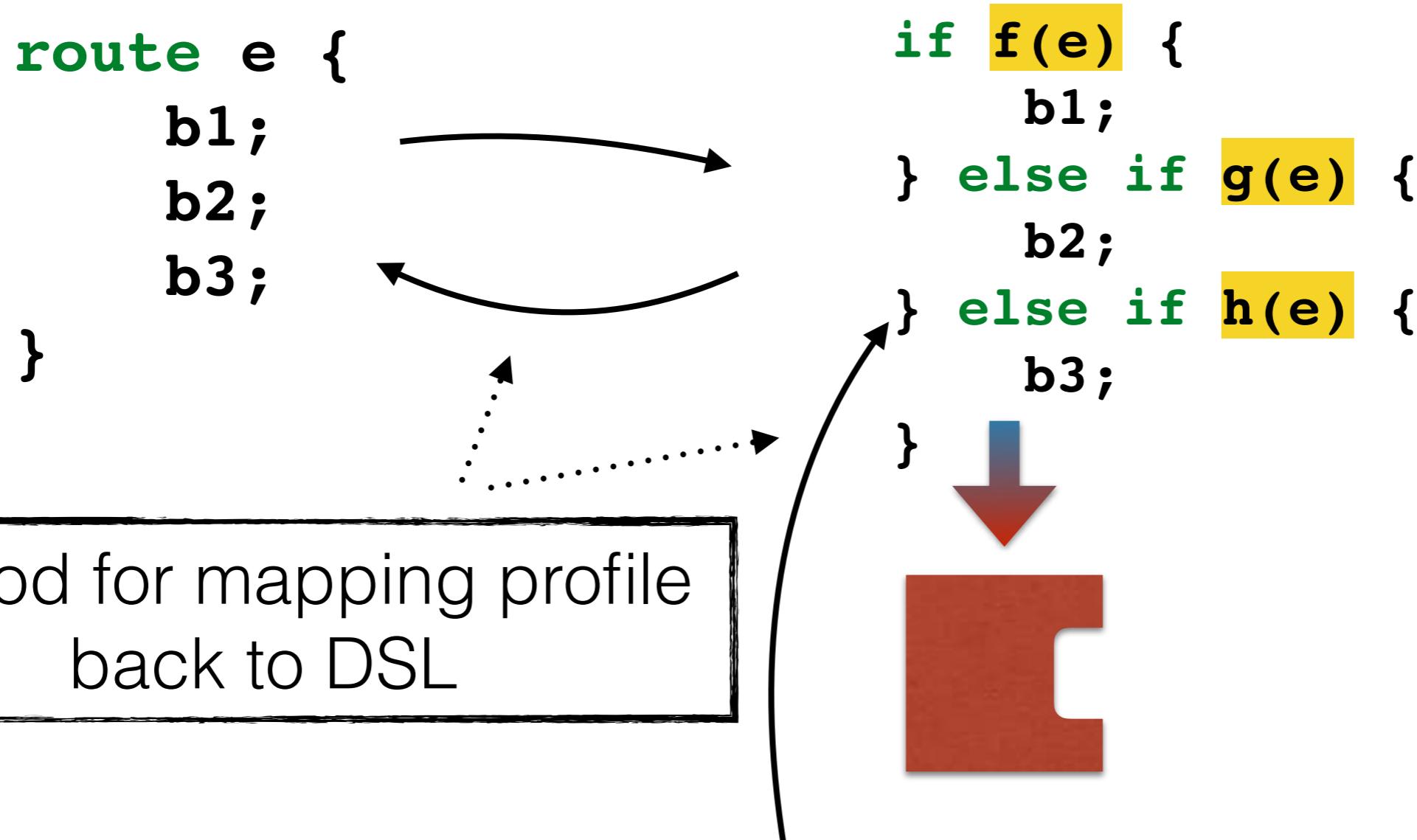
Meta-programming (macros)  
for writing DSLs

# Profile-Guided Meta-Programming



**b1** executed **8** times  
**b2** executed **2** times  
**b3** executed **102** times

# Profile-Guided Meta-Programming



Multiple profiles may belong to *same* DSL expr.  
Some profiles may belong to *no* DSL expr.

# Profile-Guided Meta-Programming

```
route e {  
    b1;  
    b2;  
    b3;  
}
```

```
if f(e) {  
    b1;  
} else if g(e) {  
    b2;  
} else if h(e) {  
    b3;  
}
```

Expand, compile and profile

b1 executed 8 times  
b2 executed 2 times  
b3 executed 102 times

# Profile-Guided Meta-Programming

```
route e {  
    b1;  
    b2;  
    b3;  
}  
  
if h(e) {  
    b3;  
} else if f(e) {  
    b1;  
} else if g(e) {  
    b2;  
}
```

Re-expand, using profile to optimize

b1 executed 8 times  
b2 executed 2 times  
b3 executed 102 times

# Profile-Guided Meta-Programming

PLDI 2015

Bowman, Miller, St-Amour, Dybvig.

Implemented for:

- Cisco's Chez Scheme
- Racket

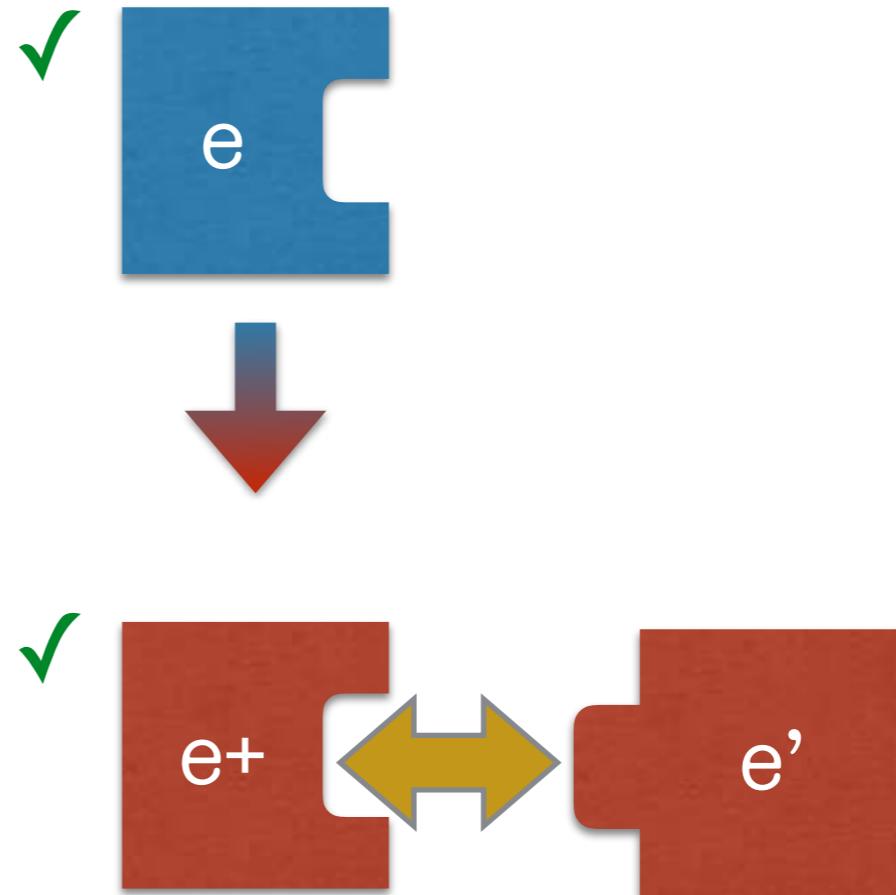
API, and design sketch for:

- Template Haskell
- MetaOCaml
- Scala

# In future

System for  
*expressing* invariant

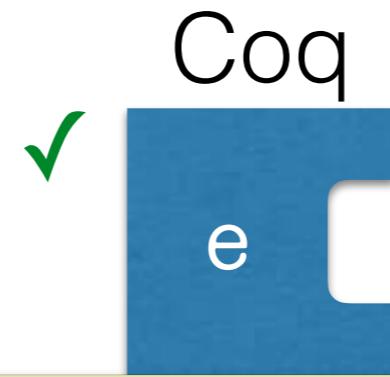
Invariant-*respecting*  
(and *exploiting*)  
transformation



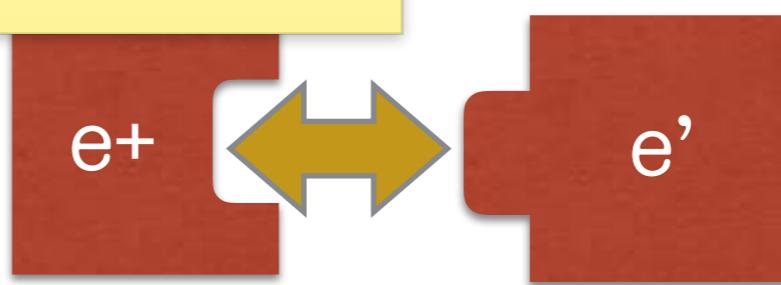
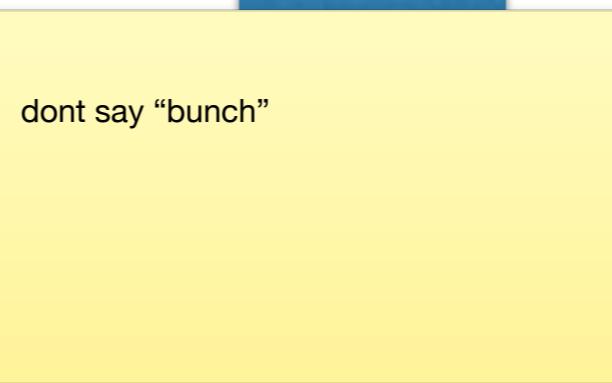
Invariant *enforcing*  
linking

# In future

Dependent Types



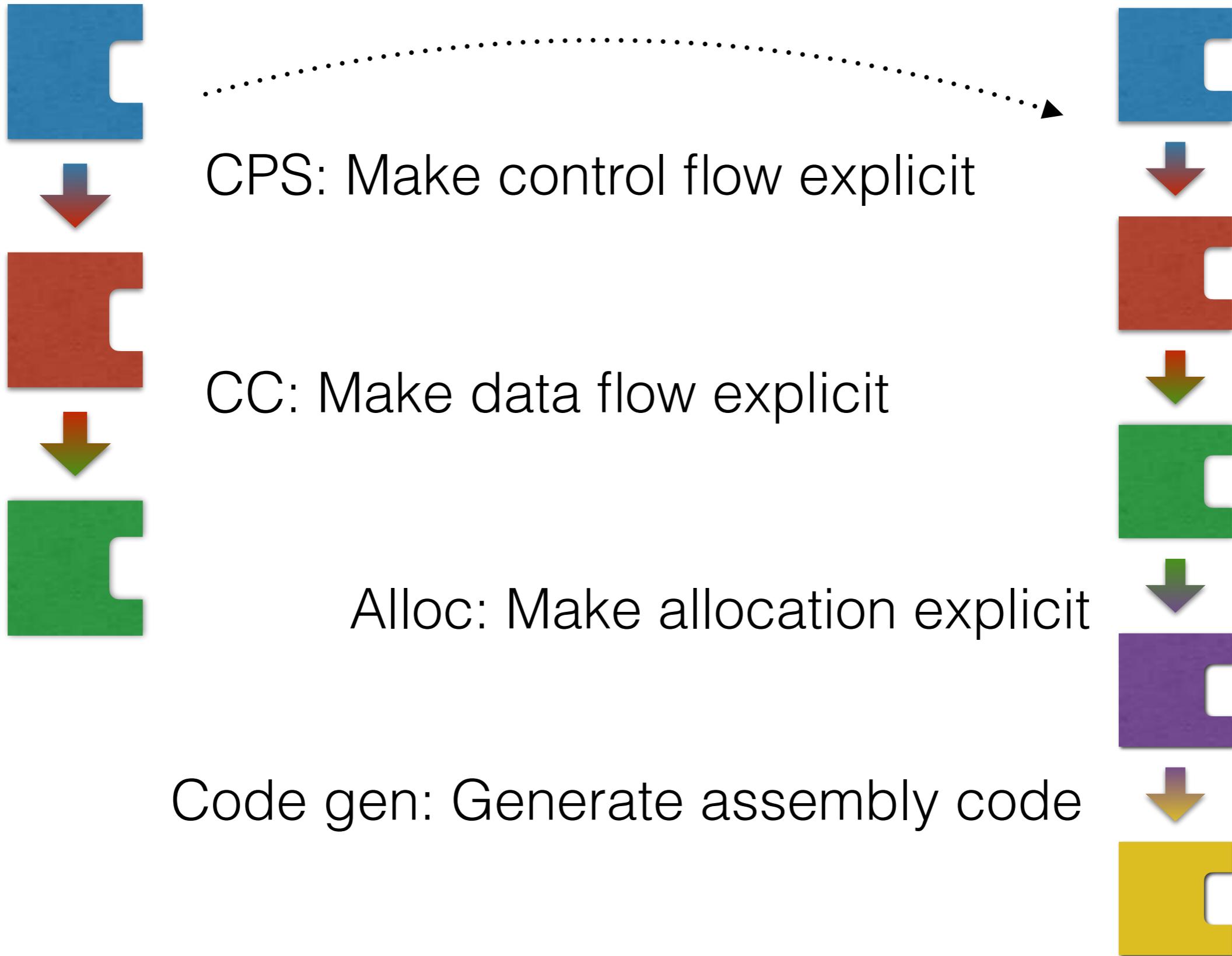
Type-preserving compiler



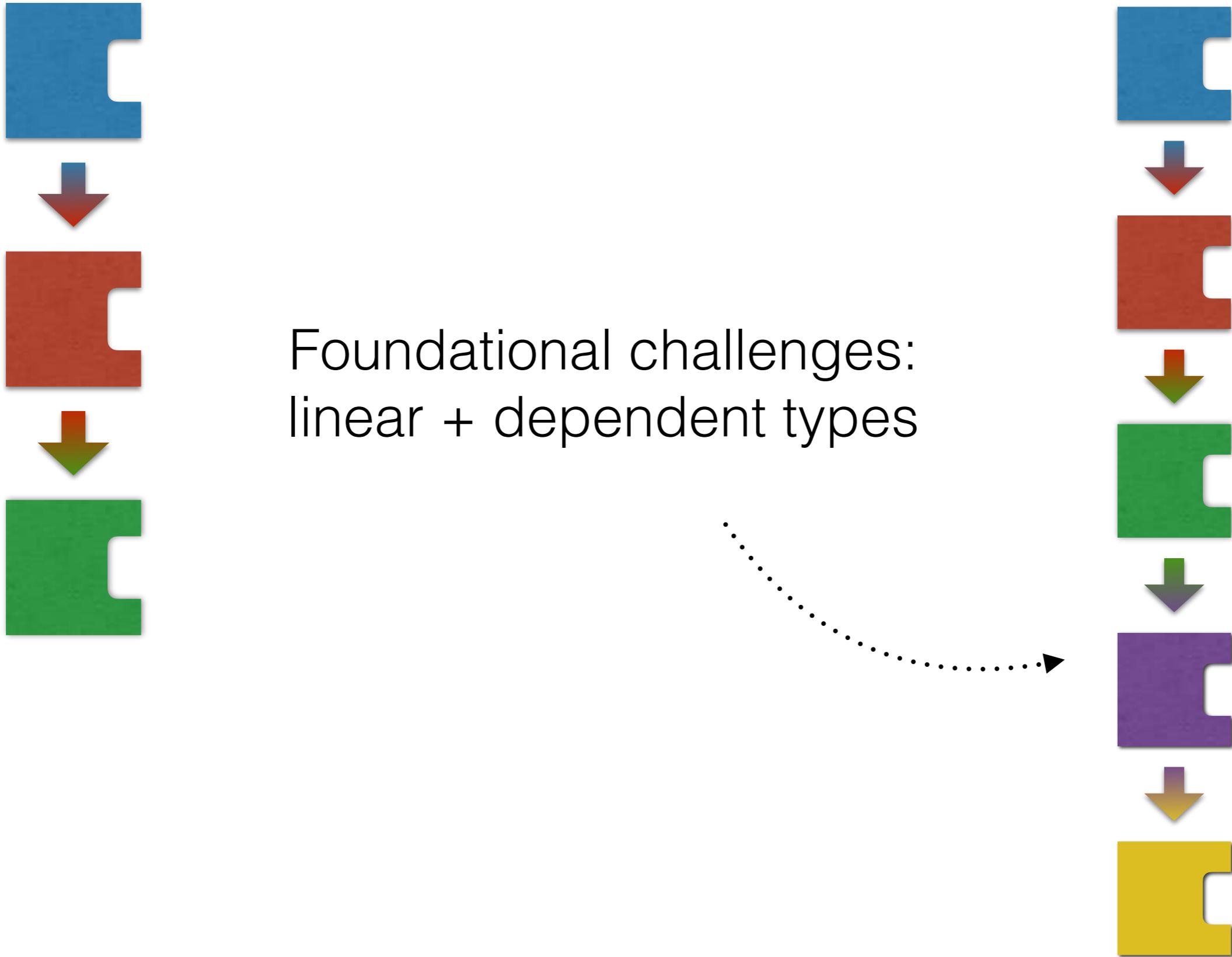
(Implement) Coq to  
Dependently Typed  
Assembly!

Type-checking at  
link time

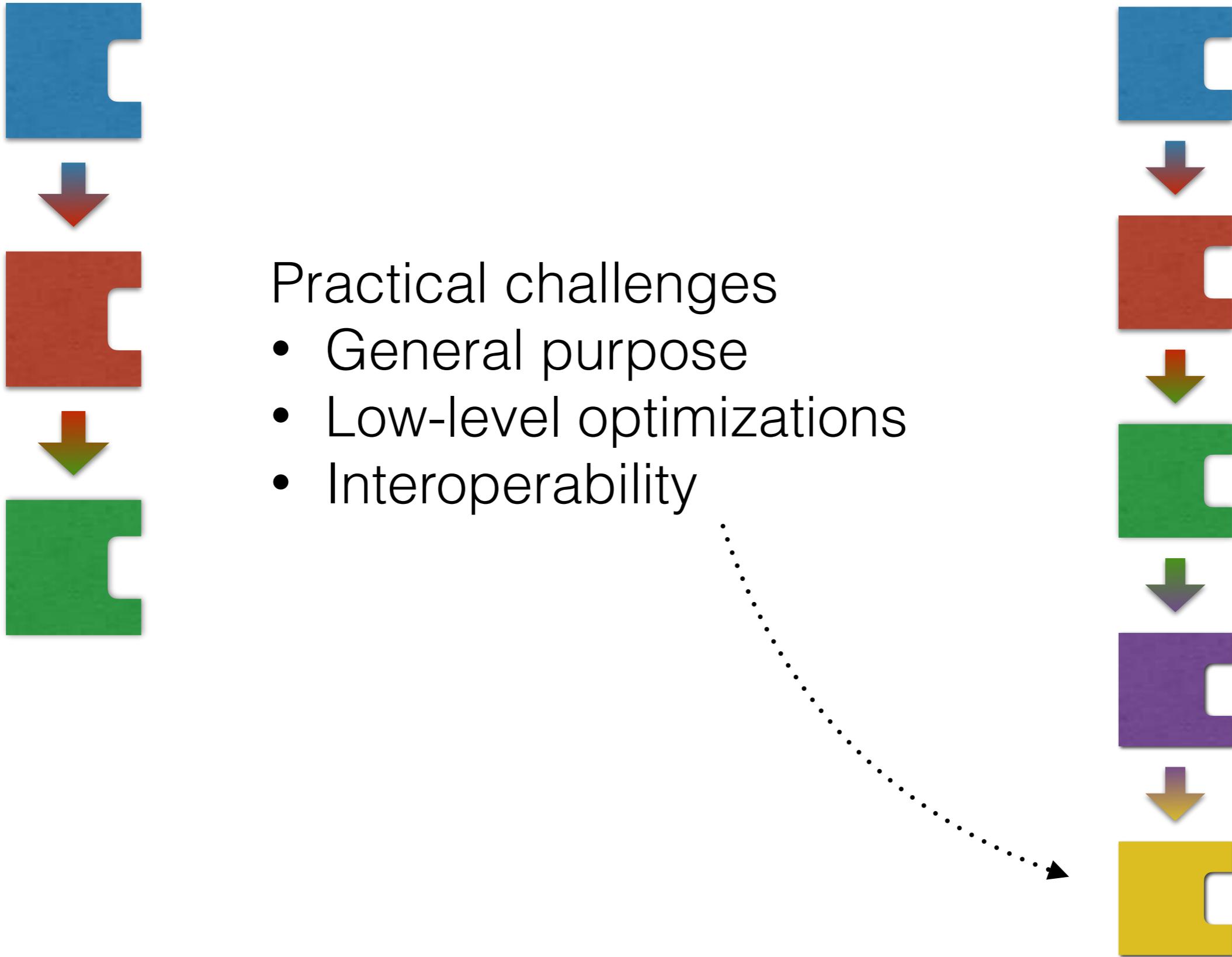
# Coq to Asm



# Coq to Asm



# Coq to Asm

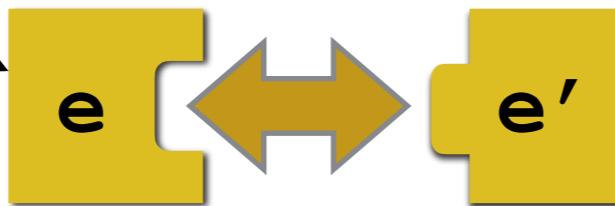


# Coq to Asm

```
> coqc verified.v  
  
> link verified.ml unverified.ml  
  
> ocaml verified.ml  
[1] 43185 segmentation fault (core dumped)  
ocaml verified.ml
```

# Coq to Asm

```
> coqc verified.v  
  
> link verified.ml unverified.ml  
  
> ocaml verified.ml  
[1] 43185 segmentation fault (core dumped)  
ocaml verified.ml
```



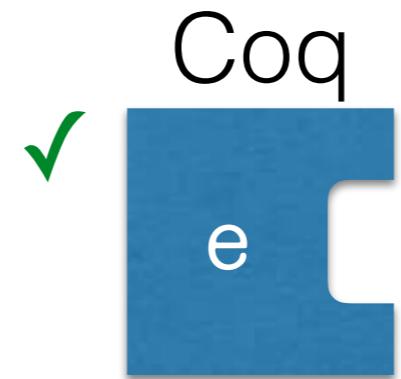
Type error! Can't prove **e'** safe

OR Types turned into dynamic checks

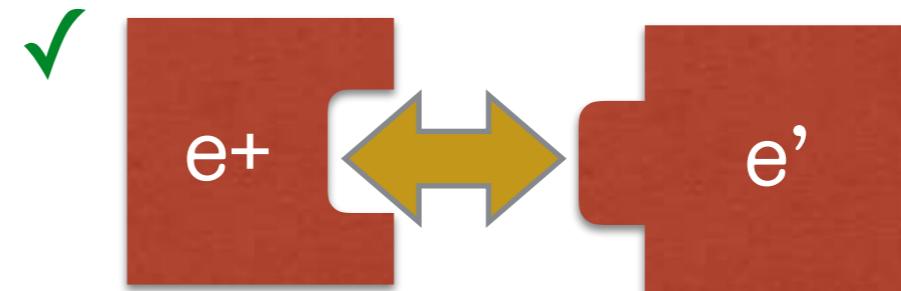
# In future

Dependent Types

Type-preserving compiler



asm



(Implement) Coq to  
Dependently Typed  
Assembly!

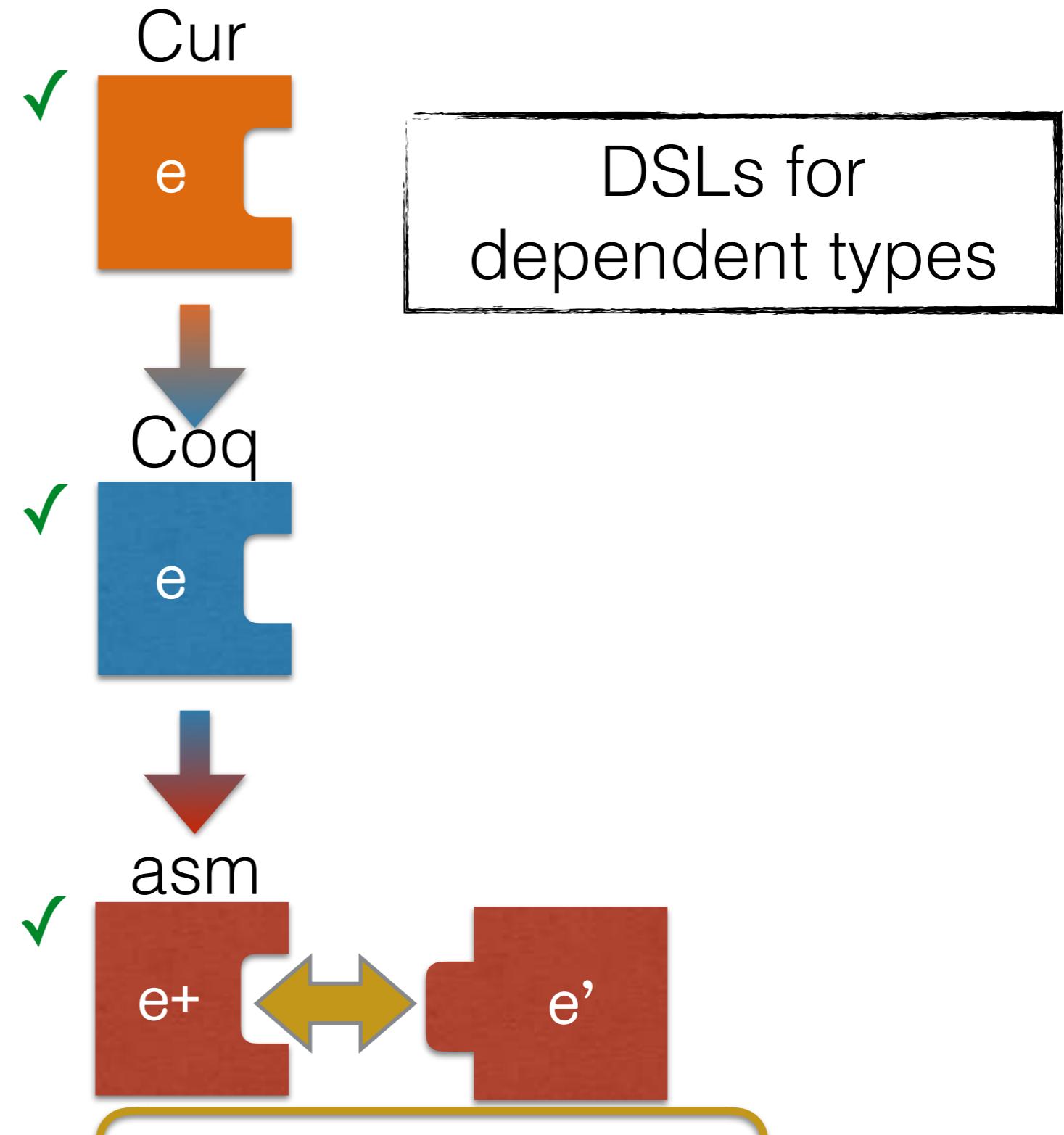
Type-checking at  
link time

# In future

Domain-Specific  
Dependent Types

Dependent Types

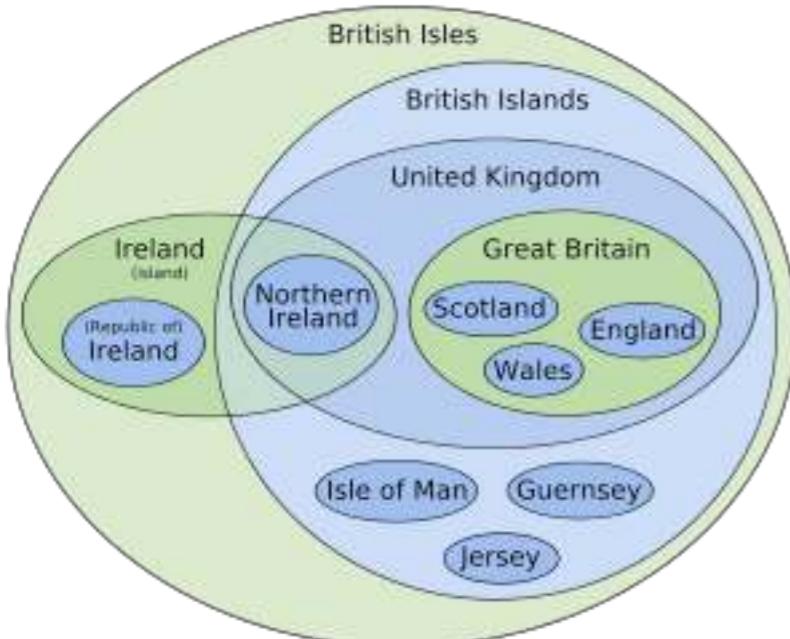
Type-preserving  
compiler



# How do you write sets in your domain?

$F = \{n \text{ is an integer} \mid 0 \leq n \leq 19\}$

**<expr>** ::= <term> | <expr> <addop> <term>



# How do you write sets in Coq

**<expr>** ::= **<term>** | **<expr><addop><term>**

```
Inductive expr : Set :=
| term_expr : term -> expr.
| add_expr : expr -> term -> expr.
```

# How do you write sets in Cur

**<expr>** ::= <term> | <expr> <addop> <term>



```
Inductive expr : Set :=
| term_expr : term -> expr.
| add_expr : expr -> term -> expr.
```

# How do you write sets in Cur

`<expr> ::= <term> | <expr> <addop> <term>`



`F = {n is an integer | 0 ≤ n ≤ 19}`



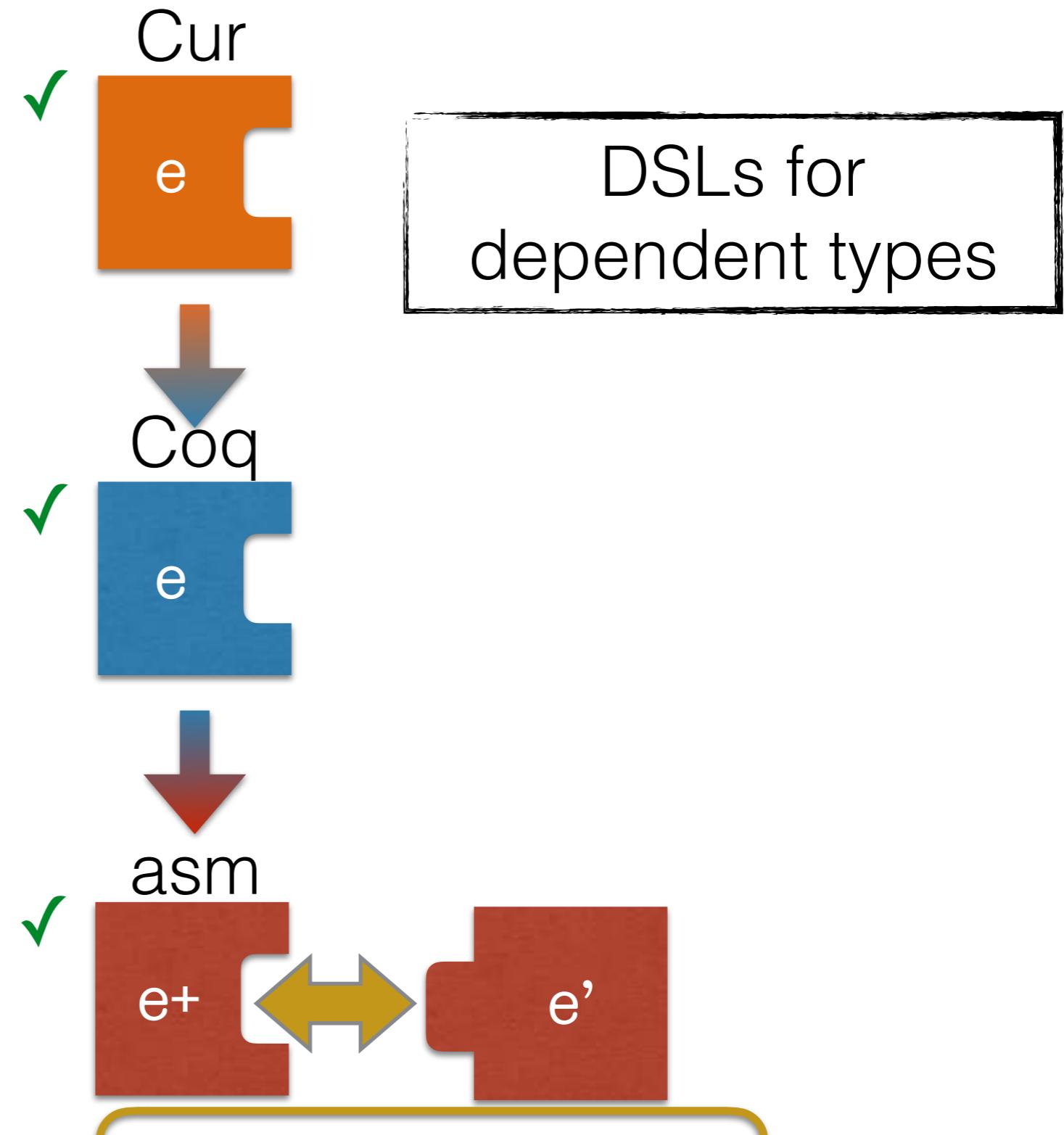
`Inductive`  `: Set :=`  
`|`  `:`  `.`  
`|`  `:`  `.`

# In future

Domain-Specific  
Dependent Types

Dependent Types

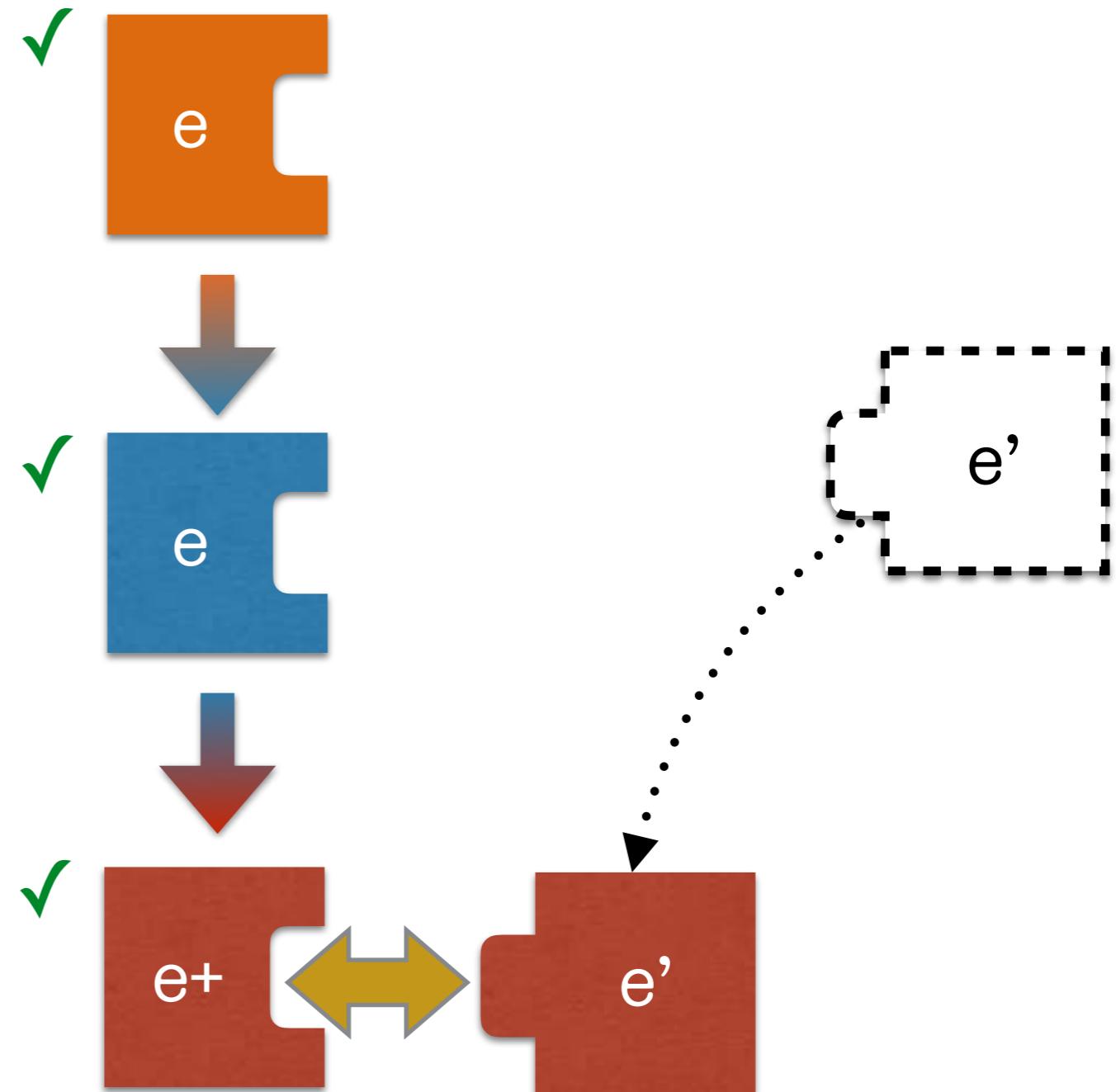
Type-preserving  
compiler



# Long term vision

*Expressing and preserving (domain-specific) invariants*

Invariant-*respecting* (and *exploiting*) compilation



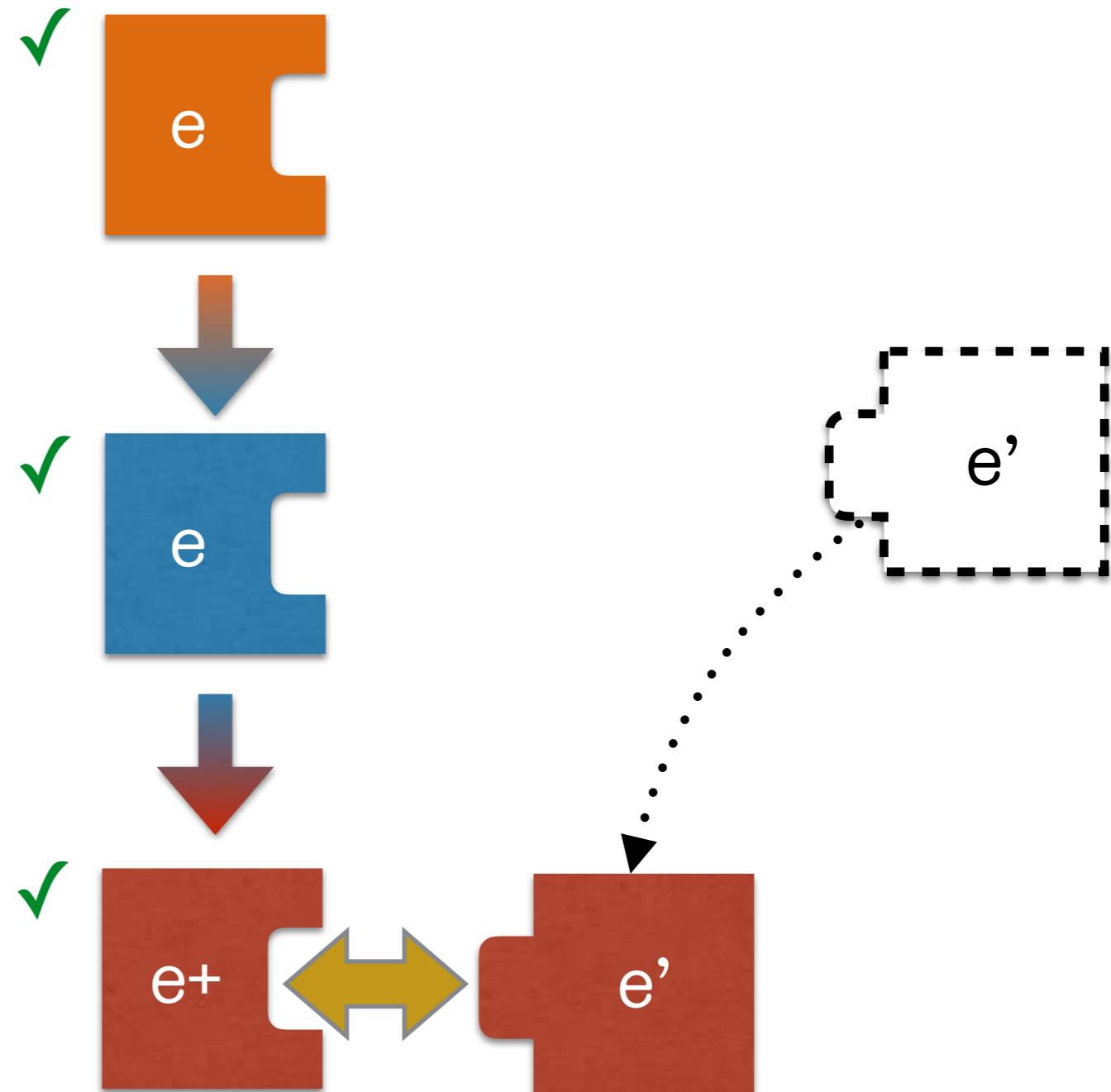
Invariant *enforcing* linking

# Do compilers respect programmers?

Not yet, but here's a recipe

*Expressing and preserving (domain-specific) invariants*

Invariant-*respecting* (and *exploiting*) compilation



Invariant *enforcing* linking