

Formally Verified Differential Dynamic Logic (in Isabelle/HOL and Coq)

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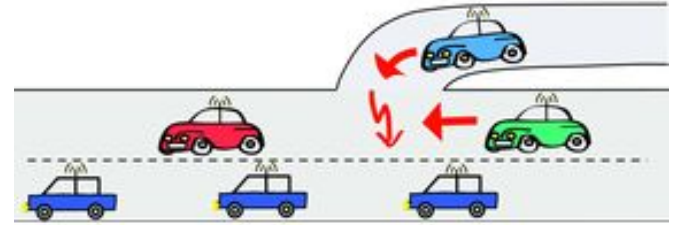
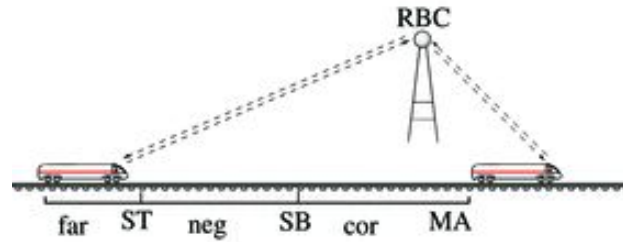
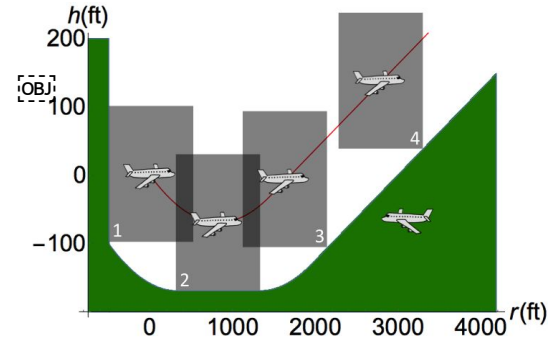
Thanks to: Johannes Hölzl, Fabian Immler, Tobias Nipkow, et. al.³
+ Coquelicot team

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Safety-Critical Control Software is Everywhere



How can we design cyber-physical systems people can bet their lives on?

– Jeanette Wing

Formal Modeling and Verification Provide Safety

- *Differential Dynamic Logic* enables constructing and verifying hybrid models
- *KeYmaera X* theorem prover implements differential dynamic logic

Example theorem: $v \geq 0 \ \& \ A() \geq 0 \rightarrow [a := A(); \{v' = a, x' = v \ \& \ \text{true}\}]v \geq 0$

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- Correct proof requires correct prover

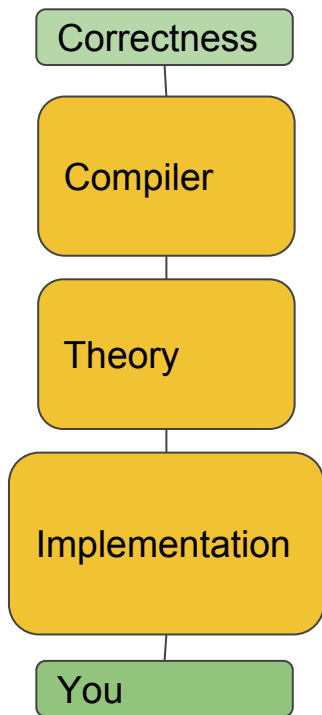
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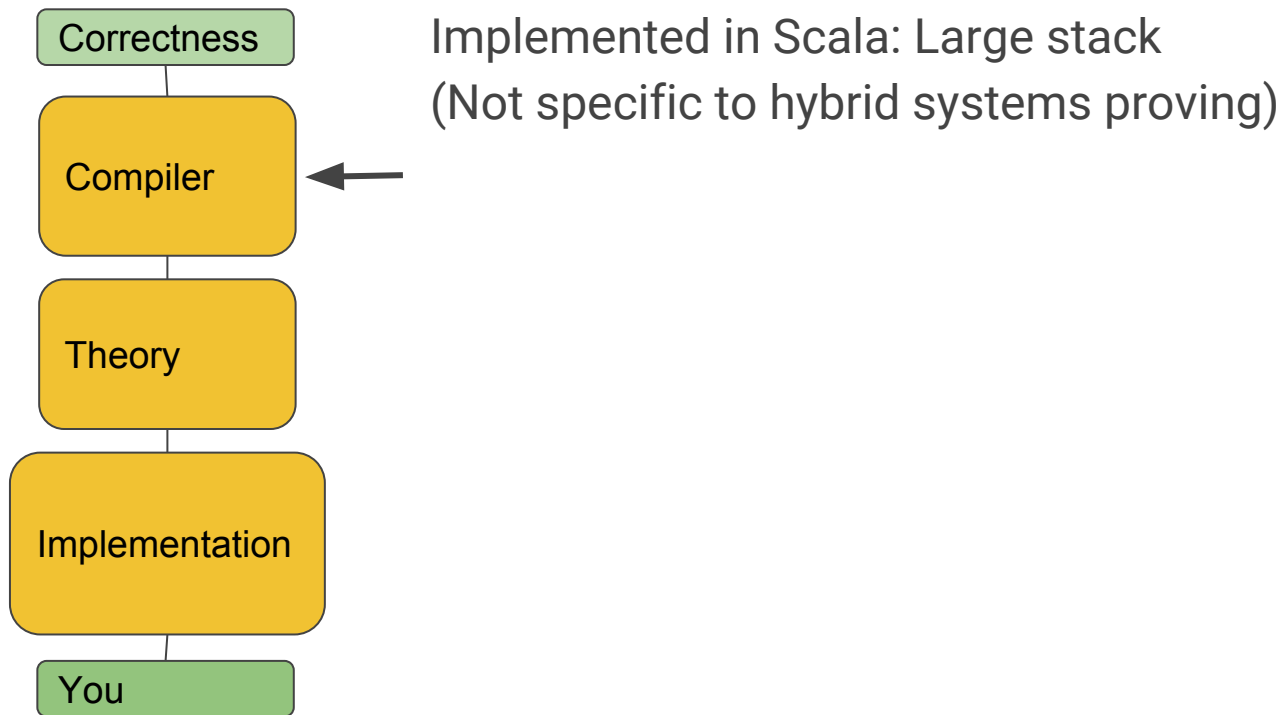
- Correct proof requires correct prover
- **Goal: Ensure correctness of KeYmaera X**

KeYmaera X Depends on a Big Stack

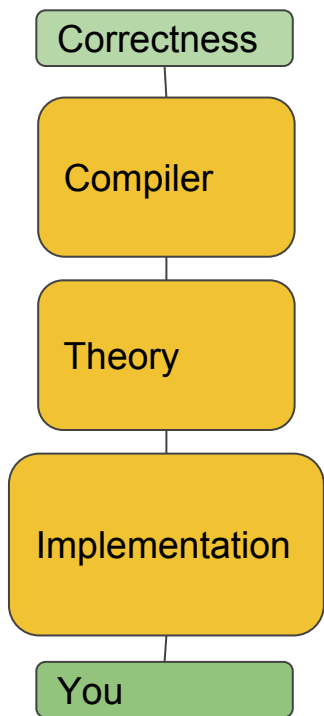


Pick part of the stack, try to improve it

KeYmaera X Depends on a Big Stack



KeYmaera X Depends on a Big Stack



LCF Approach:

- Abstract type of proofs isolates critical code
- Majority of code untrusted

Prover	Lines of Code
HOL Light	400
KeYmaera 3	66,000
<u>KeYmaera X</u>	1,700 (2%)
Isabelle/Pure	8,000
Coq	20,000
NuPrl	15,000 + 50,000
PHAVer	30,000
SpaceEx	100,000

Small Core Requires Simple Proof Calculus

Uniform Substitution (US) Simplifies Provers

$[t := 0; t' = 1] t \geq 0 \leftrightarrow [t := 0][t' = 1] t \geq 0$ Axiom Instance



$[a ; b]P \leftrightarrow [a][b]P$ Axiom

Axioms are just data

Substitution $\sigma = \{a \mapsto t := 0, b \mapsto t' = 1, P \mapsto t \geq 0\}$

Correctness

Compiler

Theory

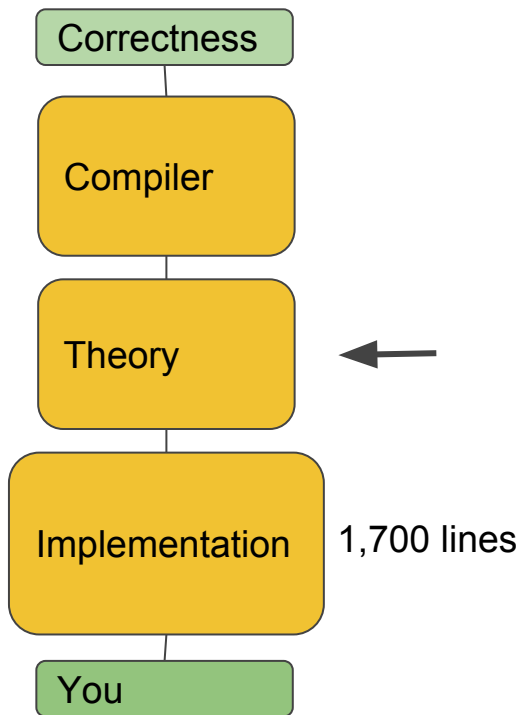
Implementation

1,700 lines

You



Uniform Substitution is Easy

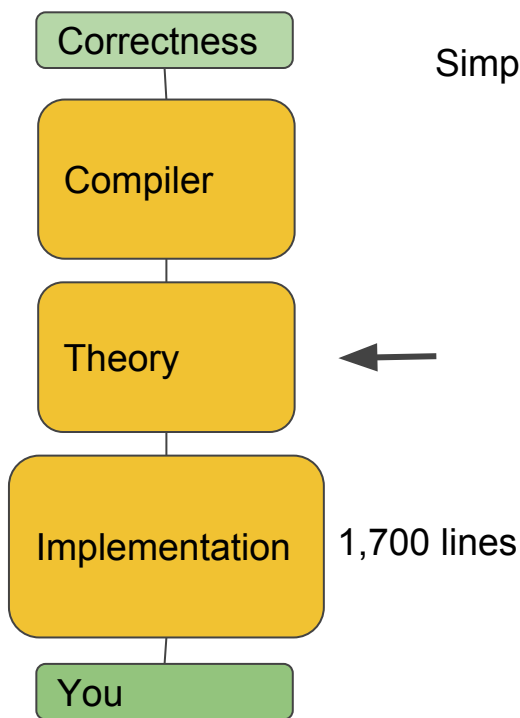


Substitution σ maps symbols to replacements
Replace recursively (Some cases **not** primitive recursive!)

Example: $\sigma = \{f \mapsto x + 1, p(y) \mapsto y \neq x\}$

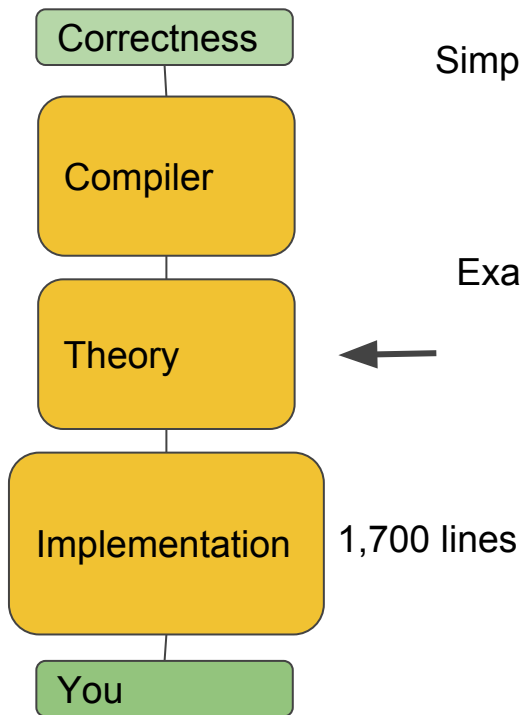
$$\begin{aligned} & \sigma(p(f)) \\ &= \sigma(p(x + 1)) \\ &= x + 1 \neq x \end{aligned}$$

Uniform Substitution is Easy



Simple Proof Rule:
$$\text{US} \frac{\varphi}{\sigma(\varphi)}$$

Uniform Substitution is Easy

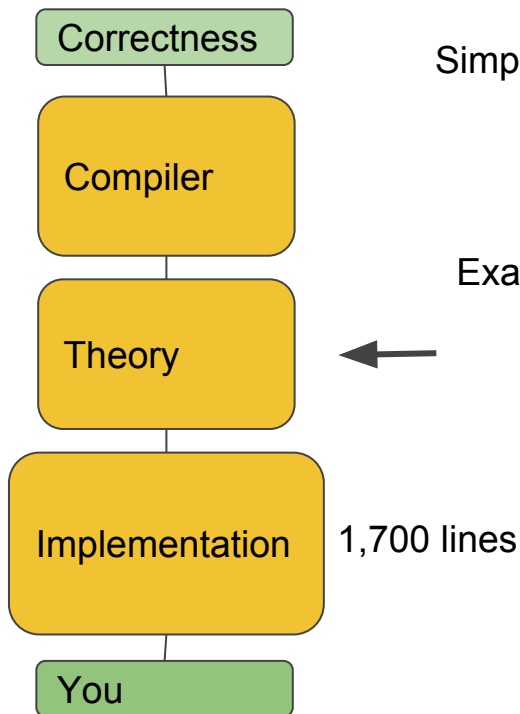


Simple Proof Rule:
$$\text{US} \frac{\varphi}{\sigma(\varphi)}$$

Example:
$$\text{US} \frac{[x := f]p(x) \leftrightarrow p(f)}{[x := _] _ \leftrightarrow _}$$

Substitution $\sigma = \{f \mapsto x + 1, p(y) \mapsto y \neq x\}$

Uniform Substitution is Easy

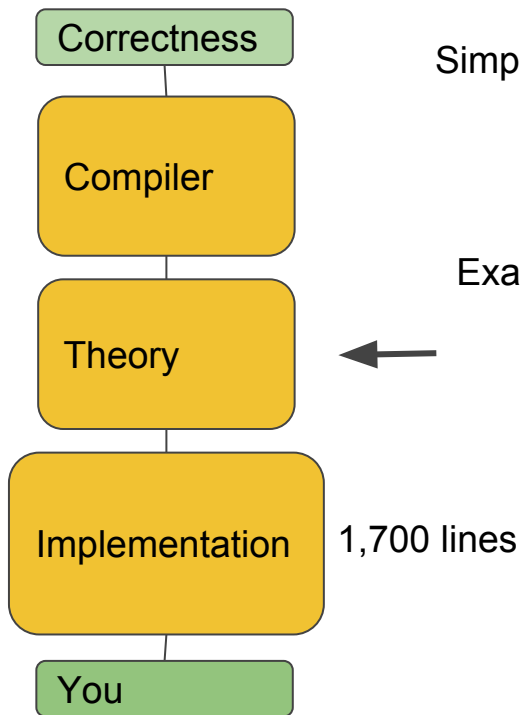


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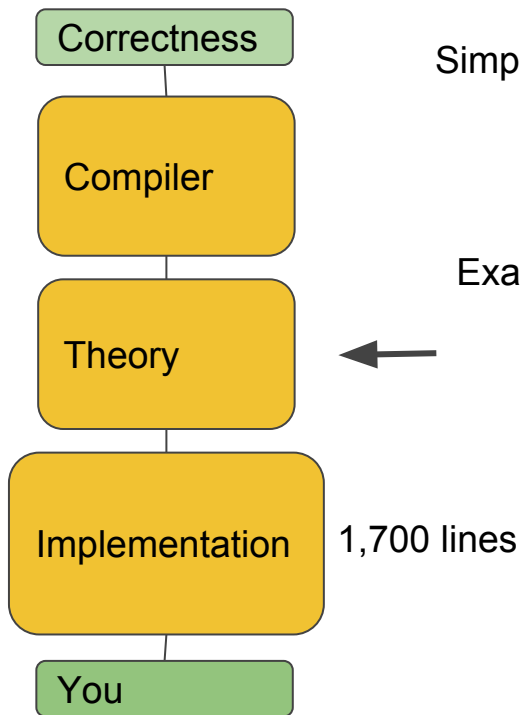


Simple Proof Rule:
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Example:
$$\text{US} \frac{[x := f]p(x) \leftrightarrow p(f)}{[x := x + 1]x \neq x \leftrightarrow _ (x + 1)}$$

Substitution $\sigma = \{f \mapsto x + 1, p(y) \mapsto y \neq x\}$

Uniform Substitution is Easy

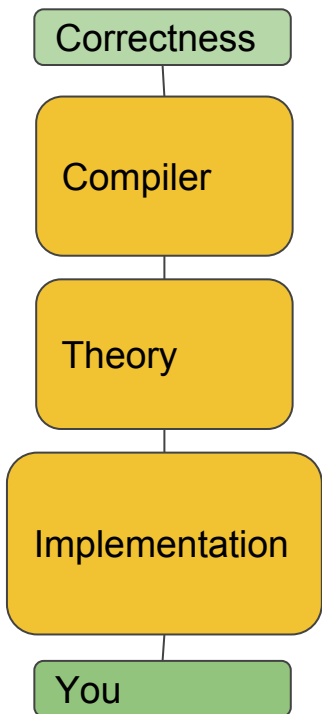


Simple Proof Rule:
$$\text{US} \frac{\varphi}{\sigma(\varphi)}$$

Example:
$$\text{US} \frac{[x := f]p(x) \leftrightarrow p(f)}{[x := x + 1]x \neq x \leftrightarrow x + 1 \neq x}$$

Substitution $\sigma = \{f \mapsto x + 1, p(y) \mapsto y \neq x\}$

Uniform Substitution is Hard



Simple Proof Rule:
$$\text{US} \frac{\varphi}{\sigma(\varphi)}$$

Example:
$$\text{US} \frac{[x := f]p(x) \leftrightarrow p(f)}{[x := x + 1]x \neq x \leftrightarrow x + 1 \neq x}$$

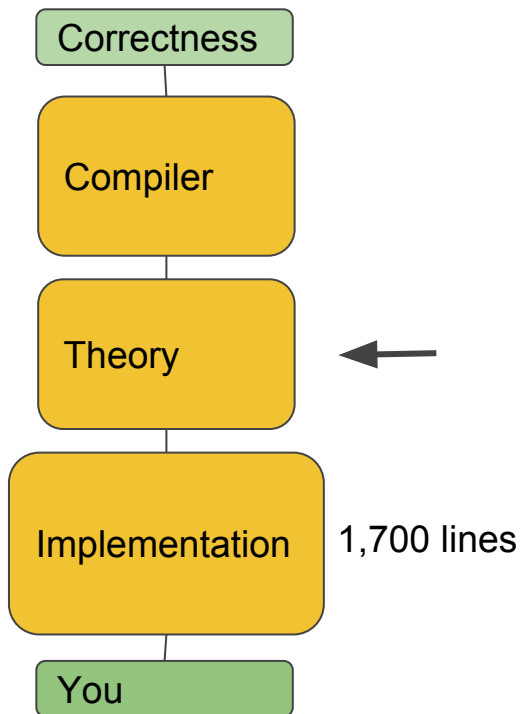
False \leftrightarrow True



Substitution $\sigma = \{f \mapsto x + 1, p(y) \mapsto y \neq x\}$

Naive Substitution: UNSOUND!

Uniform Substitution is Hard



Admissibility checks determine when substitution is sound

Example: $\sigma([\alpha]\varphi) = [\sigma(\alpha)]\sigma(\varphi)$

If $FV(\sigma) \cap BV(\alpha) = \emptyset$

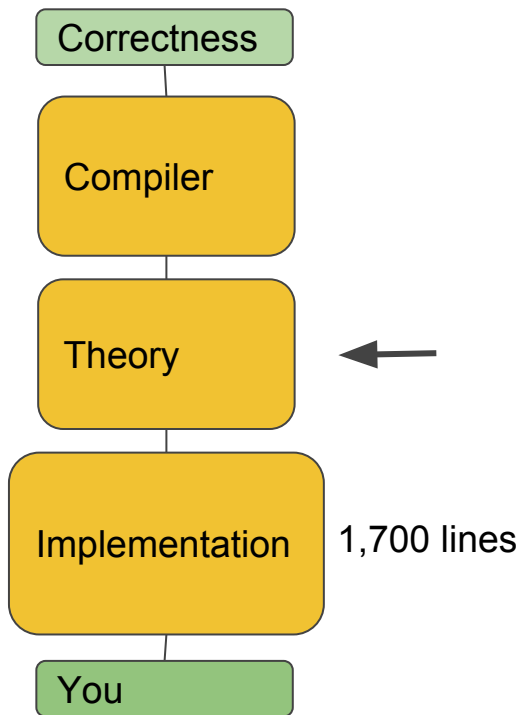
$FV(\sigma) = \{x\}$

$BV(x := f) = \{x\}$

$FV(\sigma) \cap BV(x := f) = \{x\} \neq \emptyset$

Clash Detected

Justify the Theory with Formal Verification

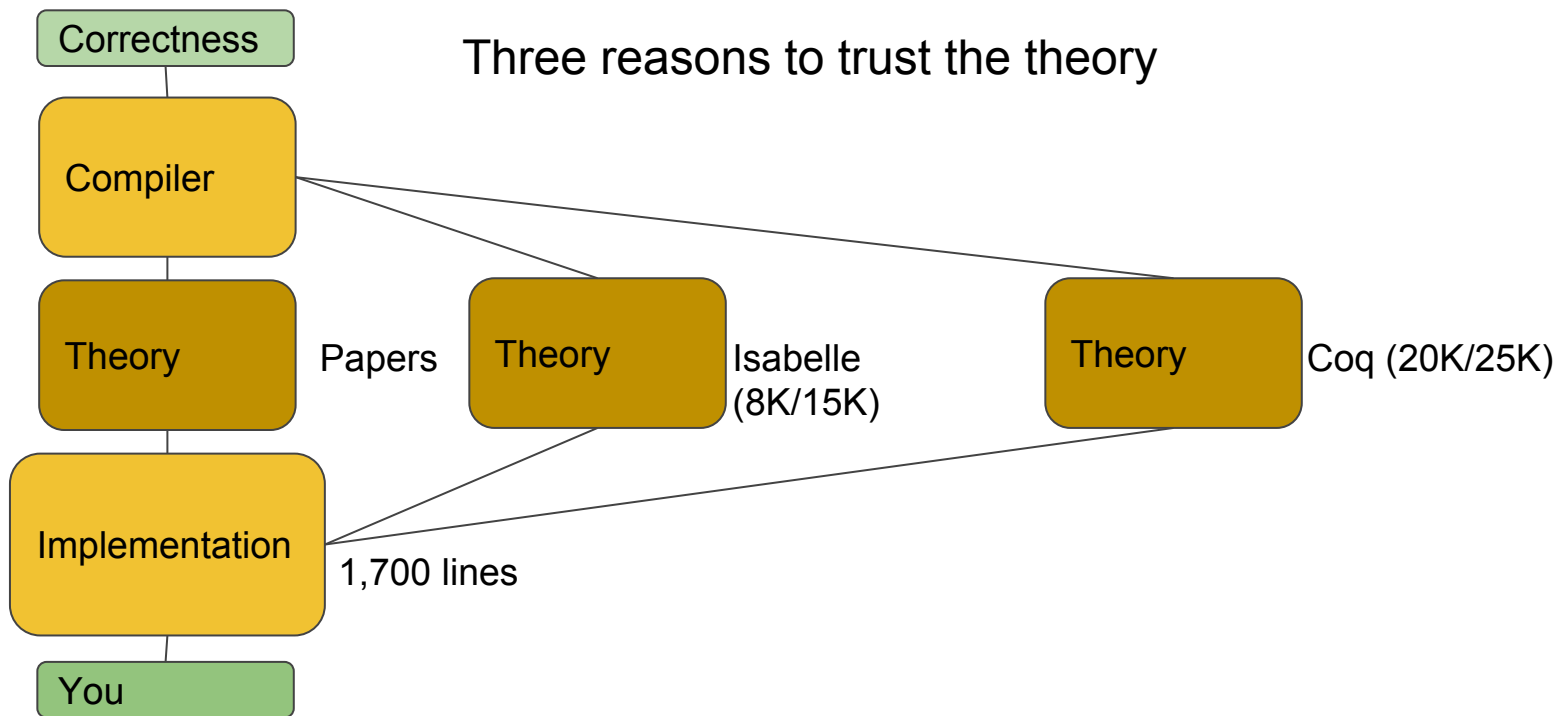


Related Work:

Verified Theorem Prover	Verified Using
HOL Light	Self*-verified
HOL Light	HOL 4
Milawa	HOL 4
Subset of Coq	Coq
Theory of NuPRL	Coq

Let's do it for hybrid systems!

Verification: Independent, Trustworthy Justification



Formalization of dL in Isabelle/HOL

(Also applies to Coq version)

What's in the Formalization?

Syntax

Dynamics

Axioms

Statics

Substitution

Renaming

Proof Checker

$\alpha, \beta ::=$
a
| $x := \theta$
| $x' := \theta$
| $?\varphi$
| (ODE & φ)
| $(\alpha \cup \beta)$
| $(\alpha; \beta)$
| α^*



```
datatype hp =  
  Pvar      id  
| Assign    id trm  
| DiffAssign id trm  
| Test      formula  
| EvolveODE ODE formula  
| Choice    hp hp  
| Sequence  hp hp  
| Loop      hp
```

Syntax \Rightarrow Datatypes

What's in the Formalization?

$$[[\alpha \cup \beta]]|v = [[\alpha]]|v \cup [[\beta]]|v$$

....



```
fun HPsem :: "interp → hp → (state * state) set"
```

```
where
```

```
| "HPsem | (Pvar p) = Programs | p"
```

```
| "HPsem | (Assign x t) = {(v, ω). ω = v (x := (θsem | t v))}"
```

```
| "HPsem | (DiffAssign x t) = {(v, ω). ω = v (x' := (θsem | t v))}"
```

```
| "HPsem | (Test φ) = {(v, v) | v. v ∈ fml_sem | φ}"
```

```
| "HPsem | (Choice α β) = HPsem | α ∪ HPsem | β"
```

```
| "HPsem | (Sequence α β) = HPsem | α O HPsem | β"
```

```
| "HPsem | (Loop α) = (HPsem | α)*"
```

Semantic Functions \Rightarrow Isabelle Functions

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What's in the Formalization?

$p() \rightarrow [a]p()$



Syntax

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```
definition Vaxiom :: formula
  where "Vaxiom  $\equiv$  ( $\varphi$  p ())  $\rightarrow$  ([[ $\alpha$  a]] ( $\varphi$  p ()))"

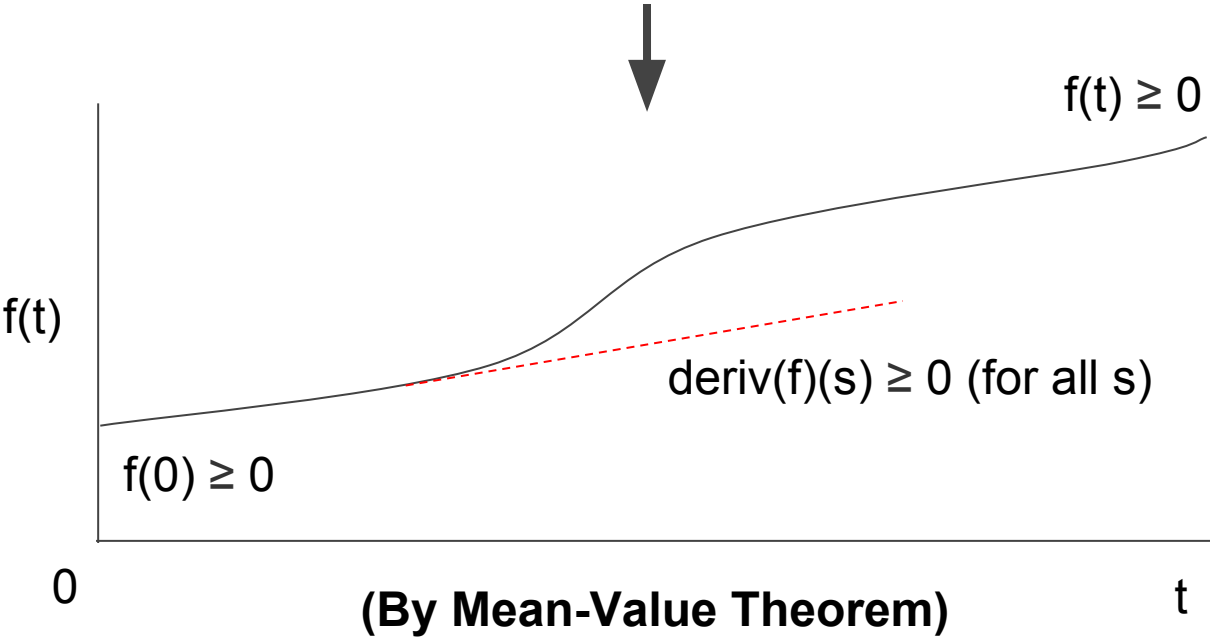
theorem V_valid: "valid Vaxiom"
  by (auto simp: valid_def Vaxiom_def)
```

Axiom \Rightarrow Definition + Validity Lemma

Differential Induction is Harder

$$f \geq 0 \rightarrow [x' = \theta \ \& \ \varphi] \text{deriv}(f) \geq 0 \rightarrow [x' = \theta \ \& \ \varphi] f \geq 0$$

- Syntax
- Dynamics
- Axioms**
- Statics
- Substitution
- Renaming
- Proof Checker



Static Semantics Enable Substitution

Syntax

Compute $FV(e)$, $BV(e)$ by structural recursion

Dynamics

Axioms

Theorem(Coincidence): Expressions depend only free variables

Statics



Theorem(Bound Effect): Programs affect only bound variables

Substitution

Definitions verified, not trusted

Renaming

Proof Checker

Static Semantics Enable Substitution

$$\sigma(\theta \geq \eta) = \sigma(\theta) \geq \sigma(\eta)$$

$$\sigma(\forall x \phi) = \forall x \sigma(\phi) \quad \text{if } \sigma \text{ } \{x\}\text{-admissible for } \phi$$

$$\sigma([\alpha]\phi) = [\sigma(\alpha)]\sigma(\phi) \quad \text{if } \sigma \text{ } \text{BV}(\sigma(\alpha))\text{-admissible for } \phi$$

Syntax

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primrec FOTsubst :: "trm \Rightarrow FOSubst \Rightarrow trm"

primrec Tsubst :: "trm \Rightarrow subst \Rightarrow trm"

inductive FOTadmit :: "FOSubst \Rightarrow trm \Rightarrow bool"

inductive Tadmit :: "subst \Rightarrow trm \Rightarrow bool"

**Formalize primitive recursive variant instead
(First-order substitution for arguments)**

Static Semantics Enable Substitution

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$$\text{US} \frac{\varphi}{\sigma(\varphi)} \quad (\sigma \text{ admissible for } \varphi)$$


```
lemma subst_fml_valid:  
assumes valid:"valid  $\varphi$ "  
assumes Fadmit:"Fadmit  $\sigma$   $\varphi$ "  
shows "valid (Fsubst  $\varphi$   $\sigma$ )"
```

New: Uniform Renaming

Syntax

Dynamics

Axioms

Statics

Substitution

Renaming

Proof Checker

$$\text{UR} \frac{\varphi}{\varphi\{x \leftrightarrow y\}}$$



```
lemma URename_sound:  
assumes "valid  $\varphi$ "  
shows "valid (FUrename x y  $\varphi$ )"
```

No Admissibility!

New: Bound Renaming Renames Destinations

Syntax

Dynamics

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Statics

Substitution

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Proof Checker

$$\text{BR} \frac{[x := \theta]\varphi}{[y := \theta]\varphi\{x \leftrightarrow y\}}$$



```
lemma BRename_sound:  
assumes valid:"valid ([[Assign x \theta]]\varphi)"  
assumes FVF:"{y, y'} \cap FVF \varphi = {}"  
shows "valid([[Assign y \theta]]FUrename x y \varphi)"
```

Yes Admissibility!

KeYmaera X Bound Rename Unsound

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BR $\frac{[x := x'] (x=x')}{[y := x'] (y=y')} \text{ BUG!}$



```
lemma BRename_sound:  
assumes valid:"valid ([[Assign x θ]]φ)"  
assumes FVF:"{y, y', x'} ∩ FV φ = {}"  
shows "valid([[Assign y θ]]FUrename x y φ)"
```



Proof Checker - Step Toward Implementation

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KeYmaera X

$\Gamma \vdash \Delta$

$$\frac{\Gamma \vdash \varphi \quad \Gamma \vdash \psi}{\Gamma \vdash \varphi \wedge \psi}$$



```
fun seq2fml :: "sequent  $\Rightarrow$  formula"  
where  
  "seq2fml (ante,succ) = Implies (foldr And ante TT) (foldr Or succ FF)"  
type pf = "sequent * derivation"  
type rule = "sequent list * sequent"
```



Examples Validate Proof Checker

Syntax

Dynamics

Axioms

Statics

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Renaming

Proof Checker



Example 1: A minimal hybrid system example (~ 100 proof steps)

$$v \geq 0 \ \& \ A() \geq 0 \rightarrow [\{v' = A(), \ x' = v \ \& \ \text{true}\}]v \geq 0$$

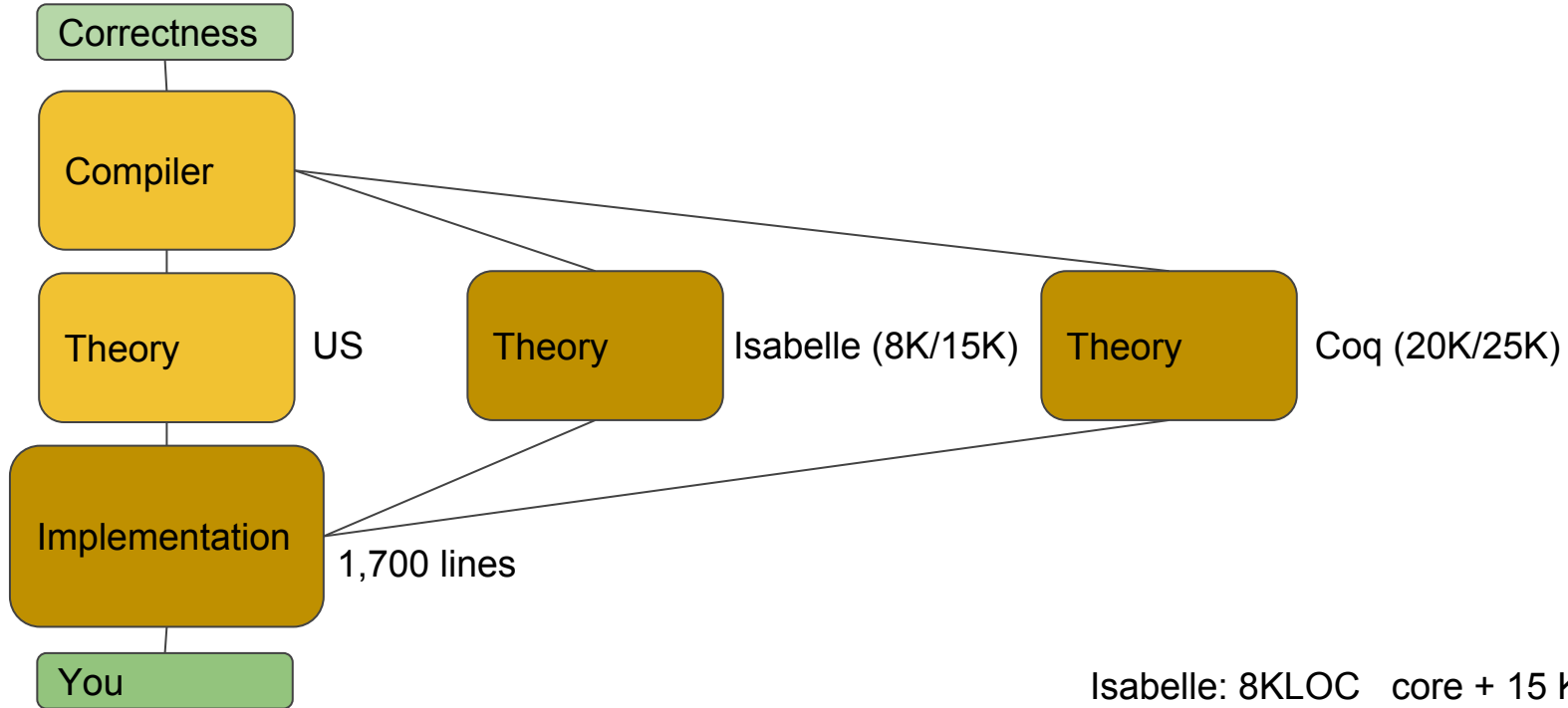
Example 2: A derived case of differential induction (~ 60 proof steps)

$$P \rightarrow [a]P' \rightarrow [a]P \quad Q \rightarrow [a]Q' \rightarrow [a]Q$$

$$P \ \& \ Q \rightarrow [a](P' \ \& \ Q') \rightarrow [a](P \ \& \ Q)$$

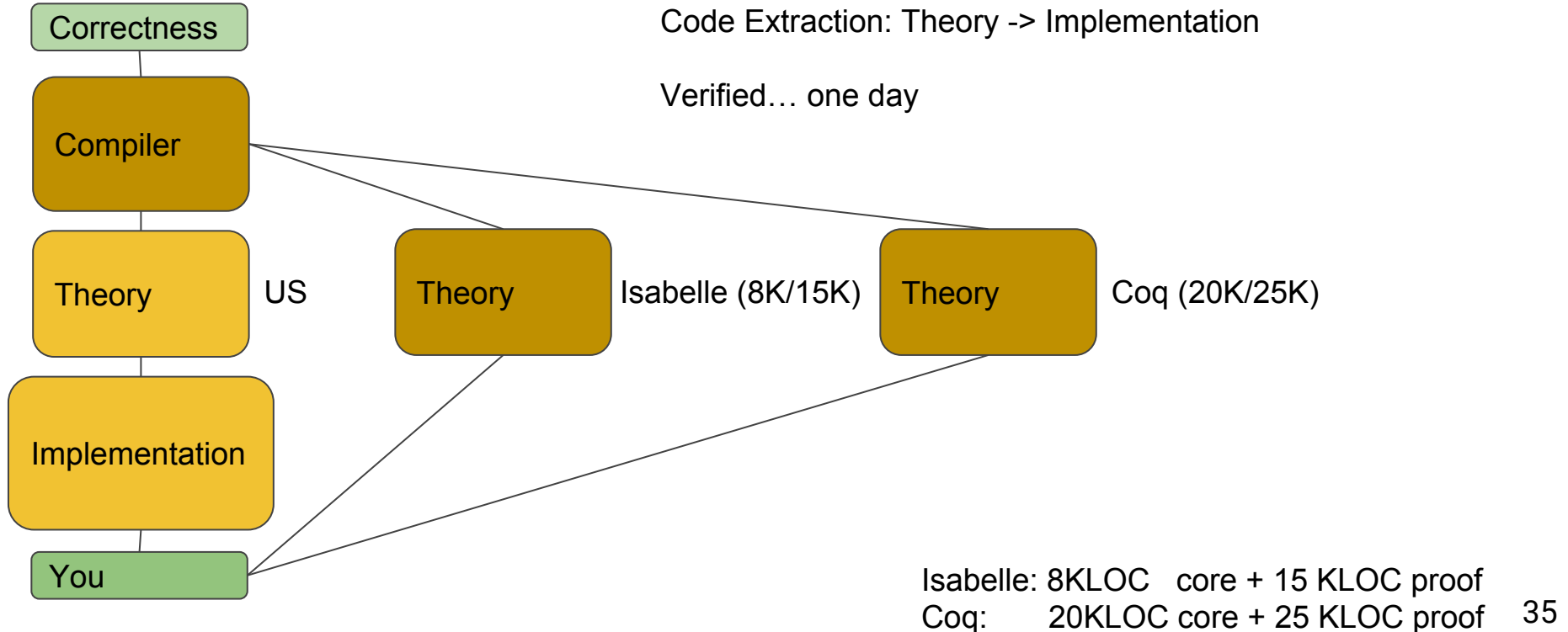
Future Work

Future Work: Further Reduce Stack

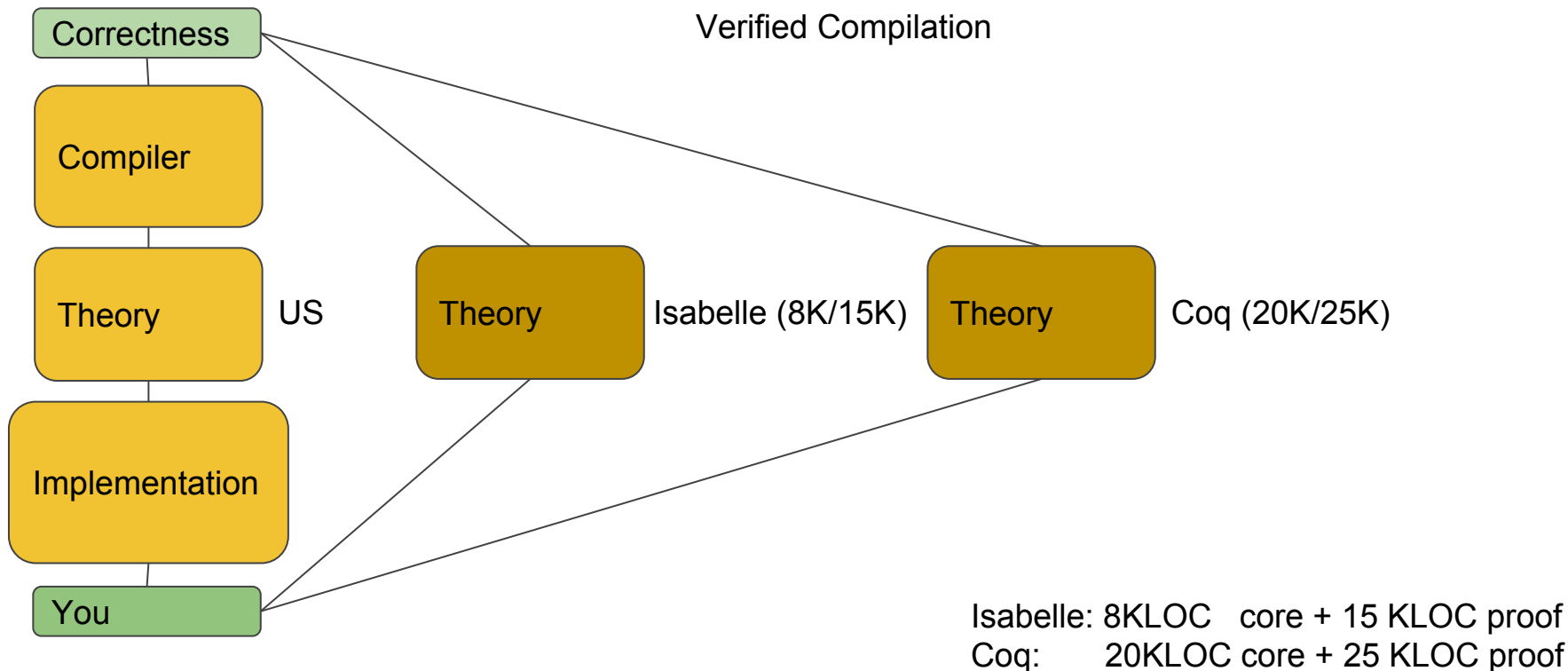


Isabelle: 8KLOC core + 15 KLOC proof
Coq: 20KLOC core + 25 KLOC proof

Future Work: Further Reduce Stack



Future Work: Further Reduce Stack



Future Work: KeYmaera X Integration

Syntax

Dynamics

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Statics

Substitution

Renaming

Proof Checker

KeYmaera X Integration

- Extract prover core from proof
- Export proof terms from KeYmaera X
- Import and check proof
- Verify theorems of real arithmetic
 - E.g. $\forall x. x^2 \geq 0$

NEXT?

Questions?

	CADE'15 [38]	JAR'16 [39]	KeYmaera X	Isabelle	Coq
systems of ODEs	[36]		✓	✓	✓
multiple argument functions	✗	✗	✓	✓	✓
infinite number of identifiers	✓	✓	✓	✗	✓
explicit set representation	✗	✗	✓	✗	✓
higher-order differentials	✗	✓	✗	✗	✓
uniform substitution defns.	1	1	1	2	2
uniform variable renaming	✗	✗	✓	✓	✓
bound variable renaming	✗	✗	✓	✓	✓
sequent calculus	[36]		✓	(✓)	(✓)
DG	✓	✓	✓	✓	✗
DG+DE: ODE systems	[37]		✓	✗	✗

Comparison of Formalizations/Presentations