Units of Measure for Hybrid Programs 15-424 Final Project

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Hybrid systems, differential dynamic logic, and KeYmaera X

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- This is a hybrid program, which models a hybrid system
- It is a formula in dL
- KeYmaera X is a theorem prover for $d\mathcal{L}$

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Verifying a model vs validating it

- Verification can be done in the proof calculus of dL (and can be partially automated/fully checked by KeYmaera X)
- Validation is checking if a model is actually representative of the system it's supposed to be modelling
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- Consider the hybrid program on the right, meant to model a 1D car that has to stop before some point
- ODE, instead of x' = v, has x' = x (which doesn't make sense physically)
- Serious mistake; model is not a car moving in a straight line
- But it passes muster in KeYmaera X 4.2b1!
- User might waste plenty of time trying to verify an unprovable model

ProgramVariables.
R x.
R S.
End.
Problem.
[{ x' = x }]x <= S
End.</pre>

Figure: An incorrect model of a 1D car

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- Lab 3 of 15-424 involved modelling a robot travelling around a circular track and verifying that it would stop before it ran into an obstacle
- A student submitted a model hinging on the test given below:
- $\bullet\,$ Subtracts a quantity with dimension L from a quantity with dimension L^2
- Subtle problem—mostly a safe if unnecessarily conservative overapproximation, *except* if *ox x* < 1? What happens then?

?((ox-x)² + (oy-y)² - v*T - (a*T²)/2 >= -((v + a*T)²)/(2*B));

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Figure: An incorrect test

How do we fix this?

- Units of measure!
- Physics people realise that comparing incommensurate quantities doesn't make sense
- CPS verification is "physics stuff"!

The weirdly-accelerating car revisited

We can annotate the incorrect model of the 1D car with units, and see what happens!

ProgramUnits. U m. End. ProgramVariables. R x : m. R S : m. End. Problem. [{ x' = x }]x <= S End.

Figure: The incorrect model of the 1D car with unit annotations

The weirdly-accelerating car revisited

```
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R S : m.
End.
Problem.
[{ x' = x }]x <= S
End.
```

Figure: The incorrect model of the 1D car with unit annotations

```
Unit analysis error

Units do not match in expression x' = x

x' = x

^ m*s^(-1) ^ m

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The neat new distance metric revisited

We isolate the problematic test in an annotated hybrid program, and see what happens.

Problem. ProgramUnits. $[?((ox-x)^2 + (oy-y)^2 - v*T]$ Um. End. $-(a*T^2)/2$ $>= -((v + a*T)^2)/(2*B));]x=x$ ProgramVariables. R ox : m.End. R.x : m. R o y : m. R y : m. R a : m/(s*s). RT: s. Rv:m/s.R A : m/(s*s). R B : m/(s*s). End.

= nac

The neat new distance metric revisited

```
ProgramUnits.
                      Problem.
Um.
                       [?((ox-x)^2 + (oy-y)^2 - v*T]
                         -(a*T^2)/2
End.
                           >= -((v + a*T)^2)/(2*B));]x=x
ProgramVariables.
 R. ox : m.
                      End.
 R. x : m.
 R oy : m.
R y : m.
Ra:m/(s*s).
 RT:s.
 Rv:m/s.
 R A : m/(s*s).
 R B : m/(s*s).
End.
Unit analysis error
unit error in term on LHS of \geq=
```

Problematic term is $(ox-x)^2+(oy-y)^2-v*T-a*T^2/2$

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Units for d $\!\mathcal{L}$ and KeYmaera X

- $\bullet\,$ We developed a monomorphic unit-of-measure type system with a top type for d ${\cal L}$
- We built a working implementation in the current version of KeYmaera X
- Our version of KeYmaera X is entirely backward-compatible with the existing version—the presence of ⊤ in the type system means that we can assign any unannotated variables type ⊤ and hence programs written without explicit units still typecheck.

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Unit-checking d $\!\mathcal{L}$

Some rules for checking terms

Times-T
$$\frac{\Upsilon \vdash x_1 : \tau_1 \qquad \Upsilon \vdash x_2 : \tau_2}{\Upsilon \vdash x_1 \times x_2 : \tau_1 \cdot \tau_2}$$

Div-T
$$\frac{\Upsilon \vdash x_1 : \tau_1 \qquad \Upsilon \vdash x_2 : \tau_2}{\Upsilon \vdash x_1 \div x_2 : \tau_1 \cdot \tau_2^{-1}}$$

Figure: Representative examples of rules for typing d \mathcal{L} terms

Unit-checking $d\mathcal{L}$ Example (times)

$$\begin{array}{c} \text{Var-T} \frac{\Upsilon(x) = m}{\Upsilon \vdash x : m} \quad \text{Var-T} \frac{\Upsilon(y) = m}{\Upsilon \vdash y : m} \\ \hline \Upsilon \vdash x \cdot y : m^2 \end{array}$$

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Unit-checking $d\mathcal{L}$ Example (divide)

$$\begin{array}{c} \text{Var-T} \\ \hline \frac{\Upsilon(x) = \mathsf{m}}{\mathsf{Times-T}} & \text{Var-T} & \frac{\Upsilon(t) = \mathsf{s}}{\Upsilon \vdash x : \mathsf{m}} \\ \hline & & \\ \hline & & \\ \Upsilon \vdash x/y : \mathsf{m} \cdot \mathsf{s}^{-1} \end{array}$$

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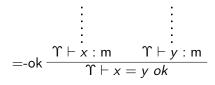
Checking $d\mathcal{L}$ formulas Rule

$$= -\mathsf{ok} \frac{\Upsilon \vdash t_1 : \tau \quad \Upsilon \vdash t_2 : \tau}{\Upsilon \vdash t_1 = t_2 \; \mathsf{ok}}$$

Figure: Representative example of rules for validating $d\mathcal{L}$ formulas

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Checking $d\mathcal{L}$ formulas Example



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Checking d \mathcal{L} programs

;-runs
$$\frac{\Upsilon \vdash P_1 \ runs}{\Upsilon \vdash P_1; \ P_2 \ runs} \frac{\Upsilon \vdash P_2 \ runs}{\Upsilon \vdash P_1; \ P_2 \ runs}$$
ODE-runs
$$\frac{\Upsilon \vdash x : \tau \qquad \Upsilon \vdash t : \tau \cdot s^{-1}}{\Upsilon \vdash \{ \ x' = t \ \} \ runs}$$

Figure: Representative examples of rules for validating d \mathcal{L} programs

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Adding units to KeYmaera X

- We implemented unit of measure types and a unit-checker in KeYmaera X in accordance with the rules given on previous slides.
- Only very minor modifications to the KeYmaera X core (the soundness-critical part of KeYmaera X)!
- Only addition of a new datatype to expressions to support units
- If you trusted KeYmaera X previously, you can still trust it now!

The normally-accelerating car

ProgramUnits. Um. End. ProgramVariables. R x : m. R v : m/s.R S : m. End. Problem. $[{ x' = v }]x \le S$ End.

Figure: A corrected model of the 1D car. Will pass the unit checker!

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Future work

- Fruitful avenue of validating hybrid systems models without having to build the real system
- Units of measure lend themselves to other interesting applications within KeYmaera X
 - Constraining invariant/proof search?
 - Improved user interface?

• Unit analysis is easy

- ... for computers!
- Fully automatable, and fully automated!
- Find more bugs today!

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Questions?

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