

KeYmaera X

A Tutorial on Interactive Verification for Hybrid Systems

Nathan Fulton
Marktoberdorf 2017

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Examples: <https://nfulton.org/marktoberdorf.zip>
Slides: <https://nfulton.org/slides/marktoberdorf.pdf>

Motivation

KeYmaera X provides strong evidence that Cyber-Physical Systems are safe. But you need to provide the model and sometimes help the proof.

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André's Lectures:

- ▶ Differential Dynamic Logics
 - Syntax and Semantics
- ▶ Sound and relatively complete axiomatizations
- ▶ Some examples

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This Lecture:

- ▶ Practical advice for modeling systems
- ▶ Hands-on Exercise proving theorems
- ▶ Example-driven

Outline

Straight Line Dynamics

The Stop Sign Model

Circular Dynamics

Loitering Outside Prohibited Airspace

Logarithmic Dynamics

Safe SCUBA Diving

Extras

The ODE Solver

Taylor Approximations as Successive Differential Cuts

The Stop Sign Model



Take-Aways from the Stop Sign Model

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Take-Aways from the Stop Sign Model

- ▶ Focus on interesting questions by **unfolding**.
- ▶ Use contextual reasoning to avoid repetition of expensive or difficult proof steps.
- ▶ KeYmaera X's **edit tool** checks your arithmetic (common and annoying source of errors, both in proofs and implementations!)
- ▶ Quantifier Elimination is a **powerful tool** useful for more than just decision procedures:
 - ▶ **Find assumptions and loop invariants** by reducing the system to arithmetic and eliminating quantifiers.
 - ▶ **ModelPlex**: $\forall x_0, x_1, \dots, x_n. \exists y_0, \dots, y_n. \varphi$ is kinda hard to check at runtime...

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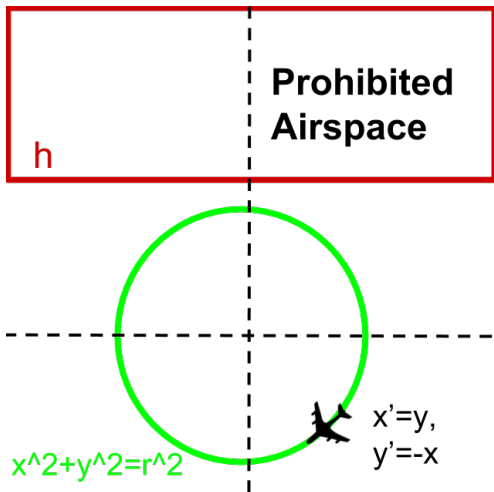
Taylor Approximations as Successive Differential Cuts

Loitering Outside Prohibited Airspace



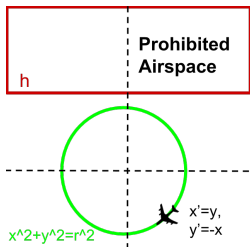
Loitering Outside Prohibited Airspace

$$y \leq h \rightarrow \underbrace{[r := *; ?r \leq h \wedge x^2 + y^2 = r^2]}_{\text{Choose circle below } h} ; \underbrace{x' = y, y' = -x}_{\text{Circular dynamics}} y \leq h$$



Lie Derivative Computations

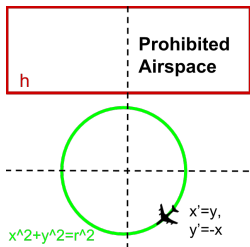
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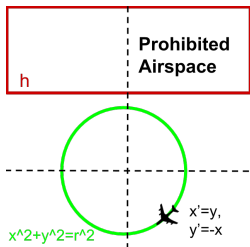


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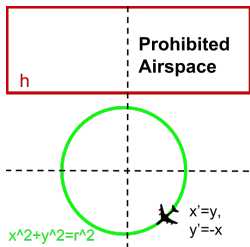
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COUNTER-EXAMPLE: $-2 \leq -2 \wedge 3 + 1 = 4 \not\rightarrow -1 \leq -2$



On Annoying Assumptions

HOME > EXTREME > THE ESA HAS FIGURED OUT WHAT KILLED THE SCHIAPARELLI MARS LANDER

The ESA has figured out what killed the Schiaparelli Mars lander

By Jessica Hall on November 30, 2016 at 2:00 pm | [38 Comments](#)



The Schiaparelli lander model

When the navigation system got wind of the IMU's wacky output, it decided that meant the spacecraft had "an estimated altitude that was negative" — that is, below ground level. In its scramble, the system released the backshell too early, fired the braking thrusters, and finally flicked on the on-ground systems as if Schiaparelli had already

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- ▶ Like loop invariants, differential invariants sometimes need **strengthening**.
- ▶ In these cases, try using differential cuts to **describe geometric constraints** on the system.
- ▶ Most early proof attempts fail due to missing *obvious* assumptions:
 - ▶ Upper/lower-bounds (esp. positivity).
 - ▶ Missing $t' = 1$ in time-triggered systems.
 - ▶ Missing control epsilon $t \leq T$ in evolution domain.
 - ▶ Interesting dynamics (e.g., missing $v \geq 0$).

Use counter-examples to find these errors.

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Safe SCUBA diving

d = Distance to Surface

$d' = v, v' = \text{acc}$

x = Heart Rate

t = Tank

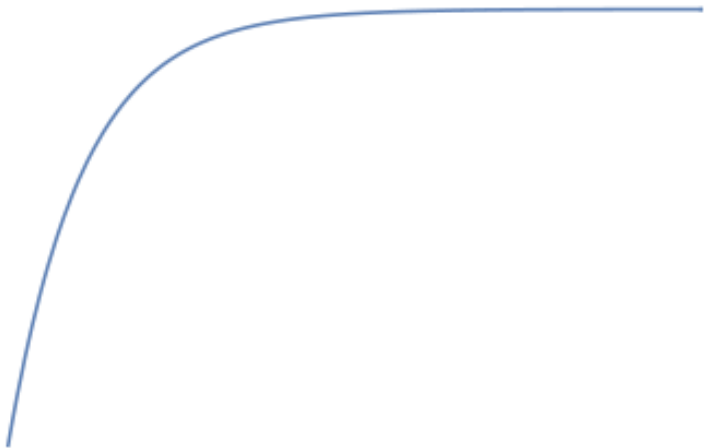
a = Target HR

b, τ = Constants

$x' = -(x-a)b, t' = -\tau x$



Heart Rate Function



$$x' = -(x - HR_{max})b$$

SCUBA Ascent Case

Differential Program:

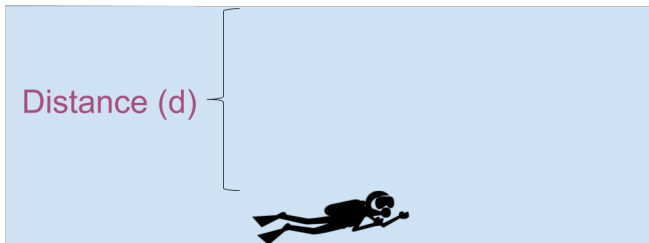
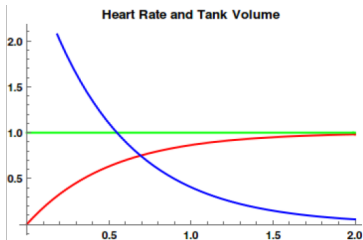
$$\dot{x} = -(x-a)b,$$

$$\dot{t} = -\tau x,$$

$$\dot{d} = v,$$

$$\dot{c} = 1$$

$$\& d \geq 0 \ \& c \leq C$$



Control Goal: Find a condition that ensures the diver reaches the surface before running out of oxygen.

SCUBA Proof Idea

$$x' = -(x - a)b, t' = -\tau x, d' = v, c' = C \quad \& \quad c \leq C \wedge d \geq 0$$

Idea: Bound time and all non-linear terms, then prove linear inequalities on these bounds by integrating.

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The **first step** requires $x \leq HR_{max}$. This is the only interesting lemma.

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$$\begin{aligned}(y^2(x - HR_{max}) = -1)' &\equiv (y^2(x - HR_{max}))' = 0 \\ &\equiv 2yy'(x - HR_{max}) + y^2x' = 0 \\ &\equiv 2yy'(x - HR_{max} + y^2(-(x - a)b) = 0 \\ &\equiv \dots \\ &\equiv y' = \frac{b}{2}y\end{aligned}$$

(All equivalences are with respect to the ODE.)

Take-aways from SCUBA Example

- ▶ As systems become harder to model, **parametric models** save the day.
- ▶ Identifying and using **differential ghosts** is (sometimes) systematic.
- ▶ **Partial solutions** to fragments of an ODE's dynamics are useful whenever you can upper-bound terms.
- ▶ Tactics \Rightarrow proof reuse

Summary



d = Distance to Surface
 $d' = v$, $v' = \text{acc}$

x = Heart Rate
 t = Tank
 a = Target HR
 b, τ = Constants

$x' = -(x-a)b$, $t' = -\tau x$

A blue heart rate monitor device with a screen displaying "95 x 80" and a diver swimming to the right.

Resources

Notes, slides, and examples from this talk:

<https://nfulton.org/marktoberdorf>

KeYmaera X website:

<https://keymaeraX.org>

Online Instance (**With Mathematica!**):

<https://web.keymaeraX.org>

Source Code (Scala):

<https://github.com/LS-Lab/KeYmaeraX-release>

KeYmaera X Credits: Stefan Mitsch, Jan-David Quesel, Marcus Völp, Brandon Bohrer, Yong Kiam Tan, André Platzer, ...

SCUBA Credits: Karim Elmaaroufi and Viren Bajaj

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$$[t' = 1 \& v = at + v_0 \wedge x = \frac{at^2}{2} + v_0t + x_0]P(t)$$

- ▶ Use univariate solve:

$$\forall s \forall 0 \leq t \leq s. v = at + v_0 \wedge x = \frac{at^2}{2} + v_0t + x_0 \rightarrow P(t)$$

Taylor Approximations in KeYmaera X

$$s' = c, c' = -s$$

$$s = \sin x = x - \frac{x^3}{3!} + \frac{x^5}{5!} - \dots$$

$$c = \cos x = 1 - \frac{x^2}{2!} + \frac{x^4}{4!} - \dots$$

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