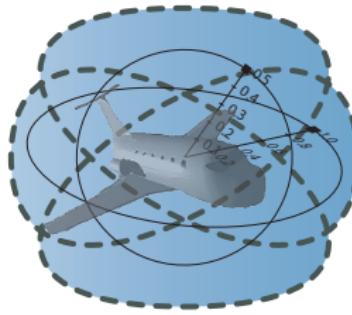


Foundations of Cyber-Physical Systems

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Computer Science Department
Carnegie Mellon University, Pittsburgh, PA



- 1 CPS are Multi-Dynamical Systems
 - Hybrid Systems
 - Hybrid Games
- 2 Dynamic Logic of Dynamical Systems
 - Syntax
 - Semantics
 - Example: Car Control Design
- 3 Proofs for CPS
 - Compositional Proof Calculus
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- 4 Theory of CPS
 - Soundness and Completeness
 - Differential Invariants
 - Example: Elementary Differential Invariants
 - Differential Axioms
- 5 Applications
- 6 Summary

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CPSs Promise Transformative Impact!

Prospects: Safe & Efficient

Driver assistance
Autonomous cars

Pilot decision support
Autopilots / UAVs

Train protection
Robots help people



Prerequisite: CPS need to be safe

How do we make sure CPS make the world a better place?

Can you trust a computer to control physics?

Can you trust a computer to control physics?

Rationale

- ① Safety guarantees require analytic foundations.
- ② Foundations revolutionized digital computer science & our society.
- ③ Need even stronger foundations when software reaches out into our physical world.

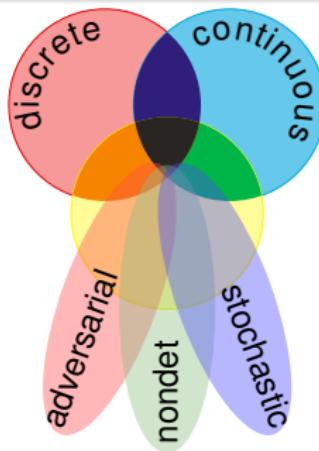
Cyber-physical Systems

CPS combine cyber capabilities with physical capabilities to solve problems that neither part could solve alone.

How can we provide people with cyber-physical systems they can bet their lives on?
— Jeannette Wing

CPS Dynamics

CPS are characterized by multiple facets of dynamical systems.



CPS Compositions

CPS combine multiple simple dynamical effects.

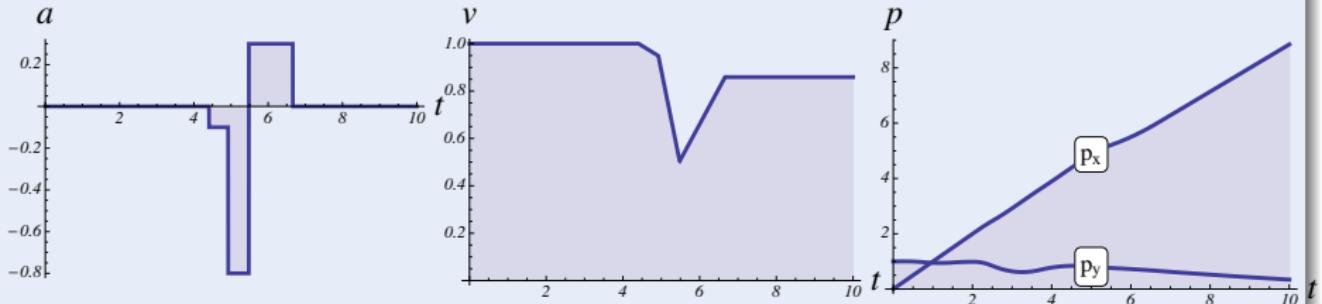
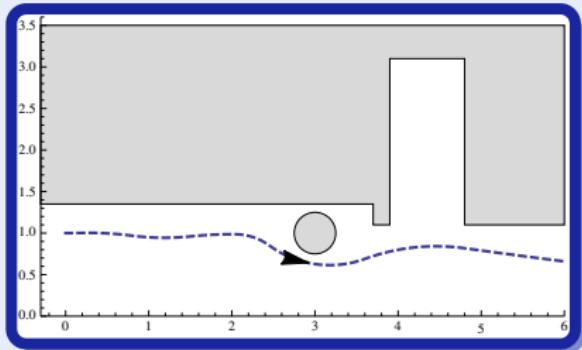
Tame Parts

Exploiting compositionality tames CPS complexity.

Challenge (Hybrid Systems)

Fixed rule describing state evolution with both

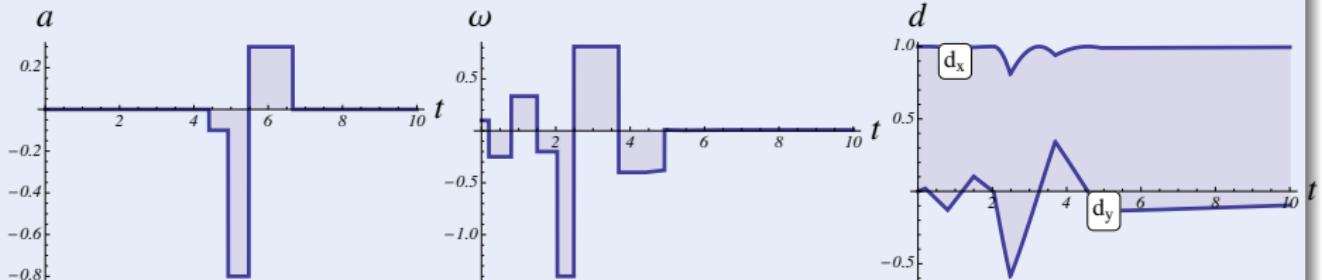
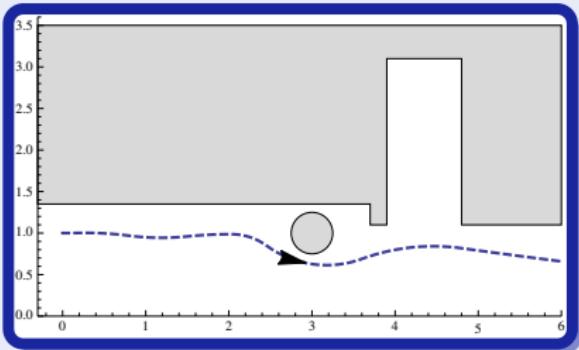
- Discrete dynamics (control decisions)
- Continuous dynamics (differential equations)



Challenge (Hybrid Systems)

Fixed rule describing state evolution with both

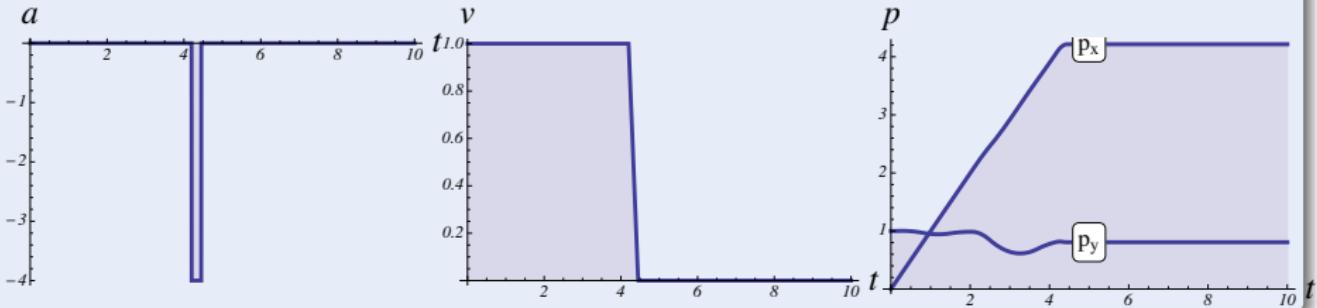
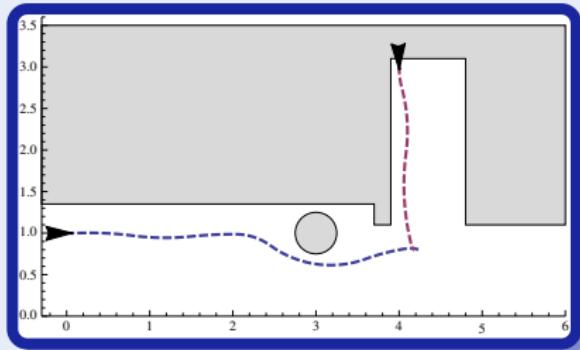
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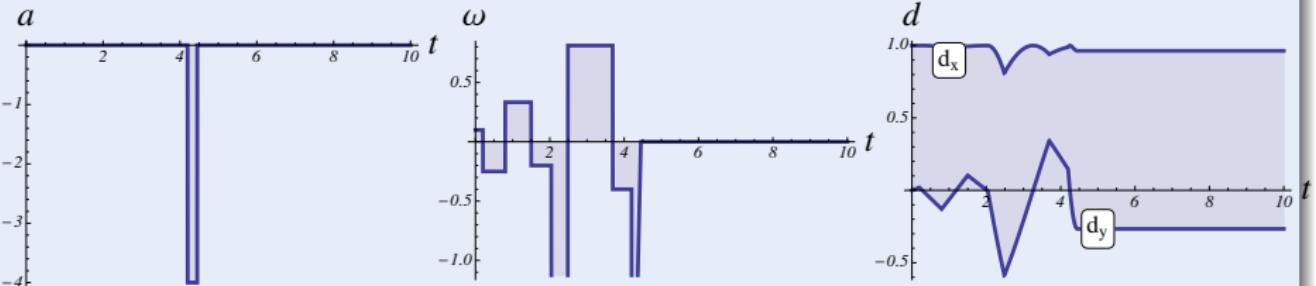
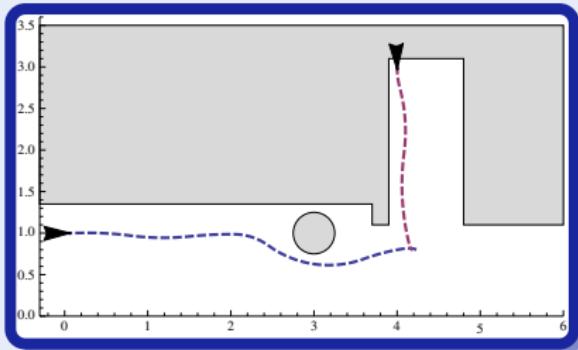
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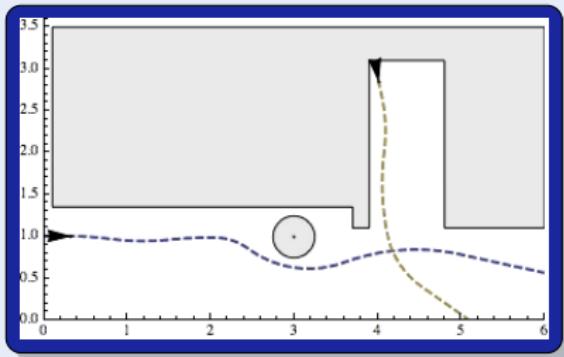
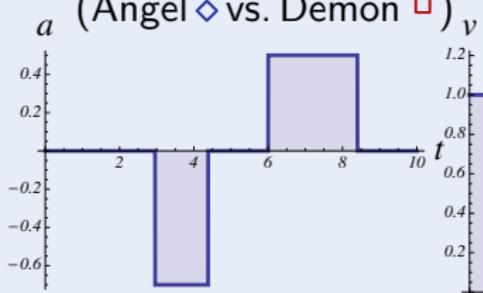
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Challenge (Hybrid Games)

Game rules describing play choices with

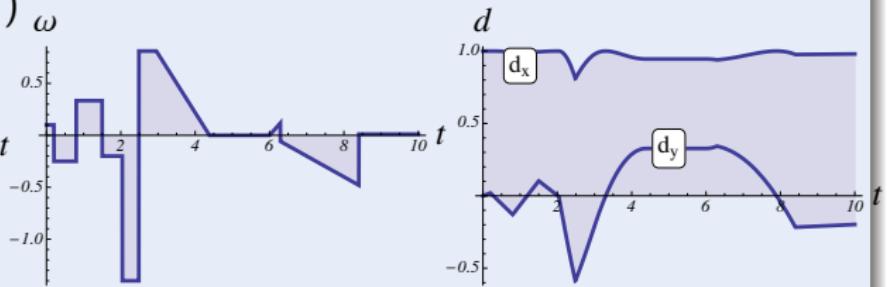
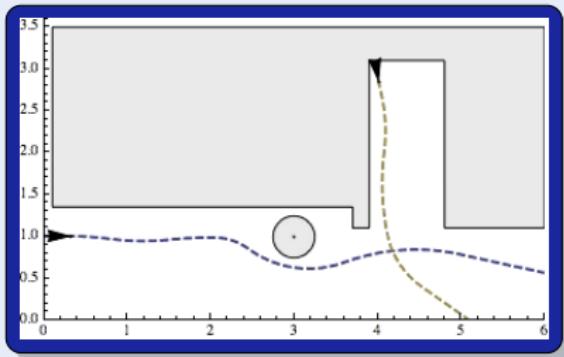
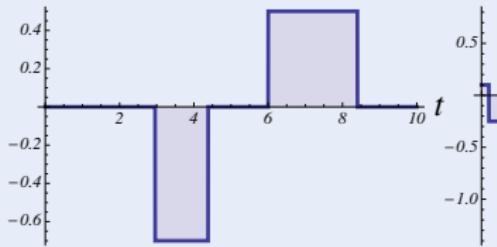
- Discrete dynamics (control decisions)
- Continuous dynamics (differential equations)
- Adversarial dynamics (Angel \diamond vs. Demon \square)



Challenge (Hybrid Games)

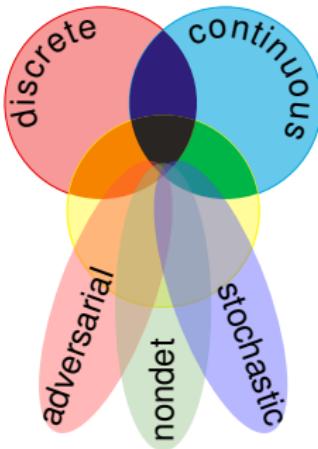
Game rules describing play choices with

- Discrete dynamics (control decisions)
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- a (ω)



hybrid systems

$$\text{HS} = \text{discrete} + \text{ODE}$$

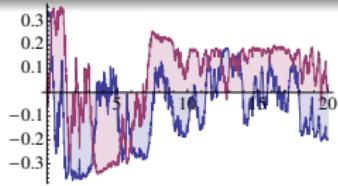


hybrid games

$$\text{HG} = \text{HS} + \text{adversary}$$

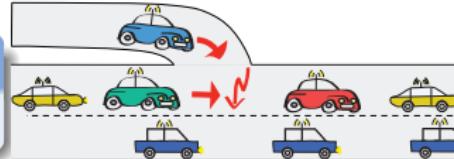
stochastic hybrid sys.

$$\text{SHS} = \text{HS} + \text{stochastics}$$



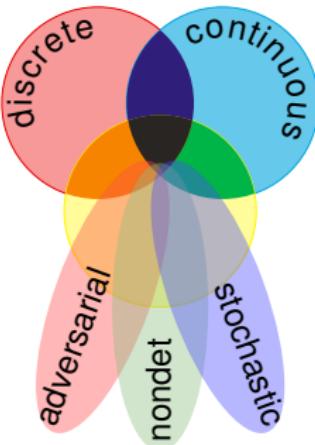
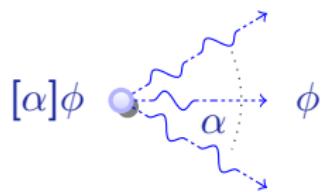
distributed hybrid sys.

$$\text{DHS} = \text{HS} + \text{distributed}$$



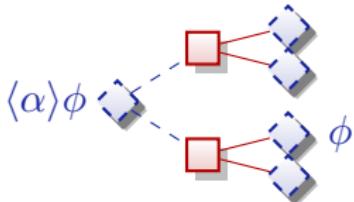
differential dynamic logic

$$d\mathcal{L} = DL + HP$$



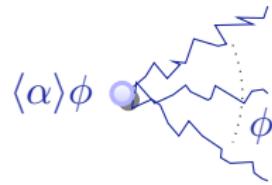
differential game logic

$$dG\mathcal{L} = GL + HG$$



stochastic differential DL

$$Sd\mathcal{L} = DL + SHP$$



quantified differential DL

$$Qd\mathcal{L} = FOL + DL + QHP$$

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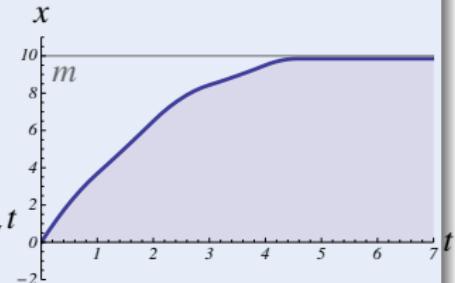
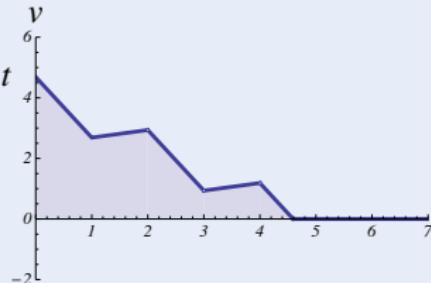
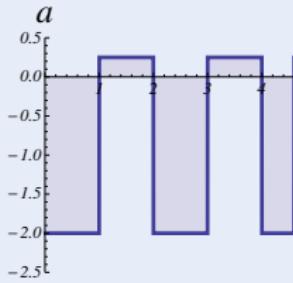
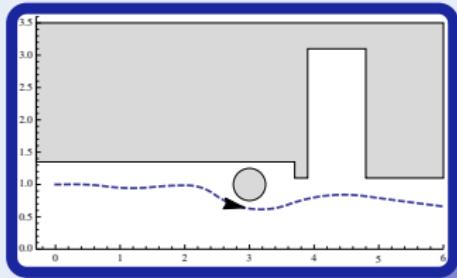
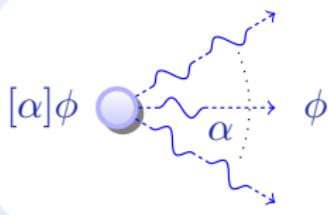
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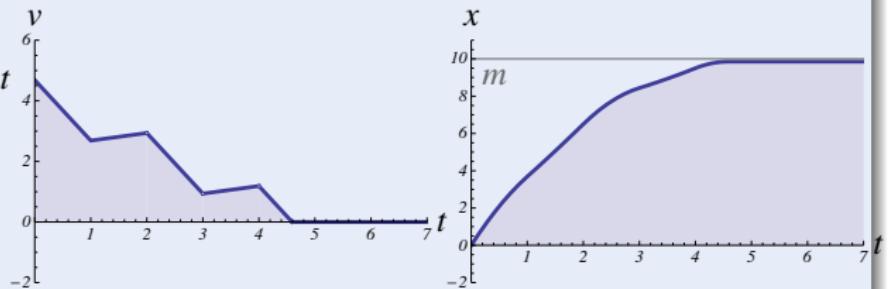
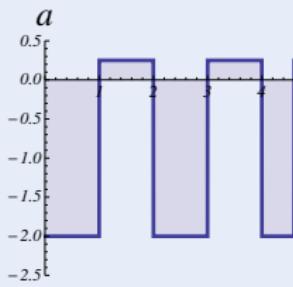
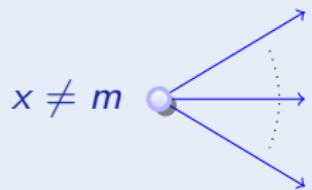
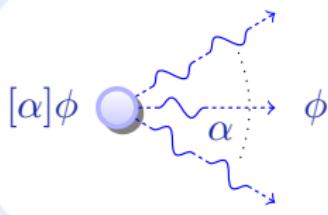
Concept (Differential Dynamic Logic)

(JAR'08,LICS'12)



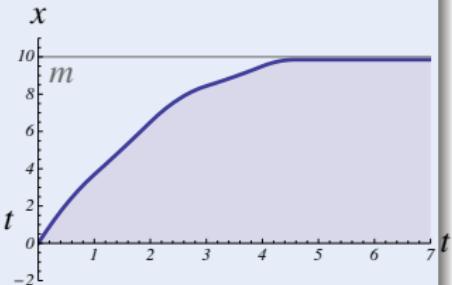
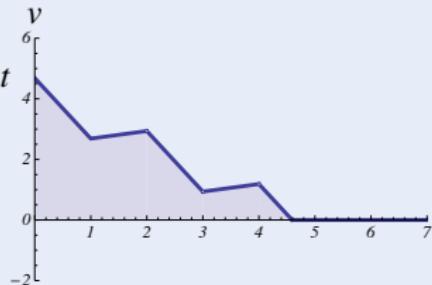
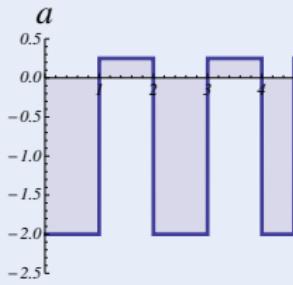
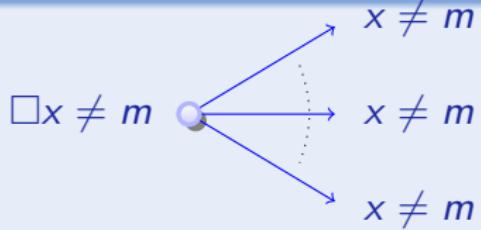
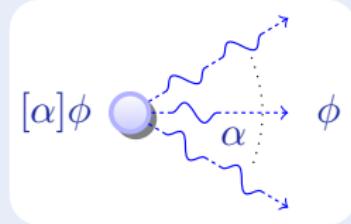
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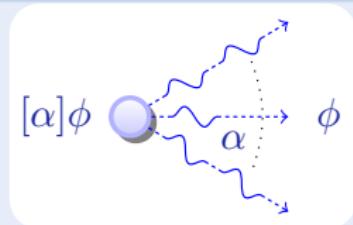


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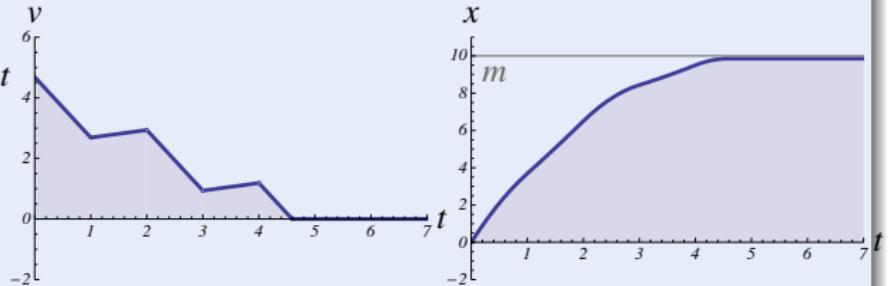
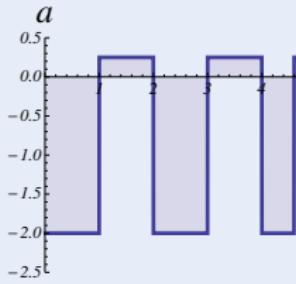
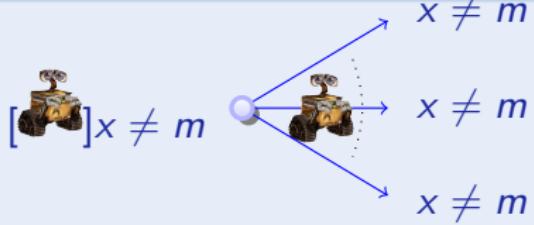
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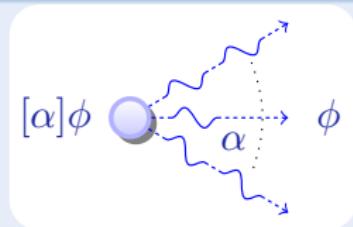
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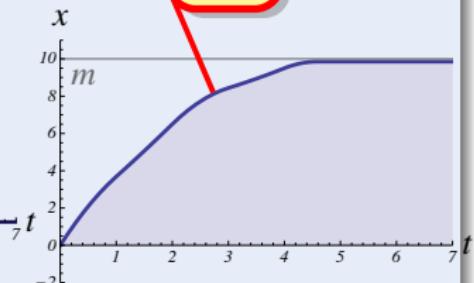
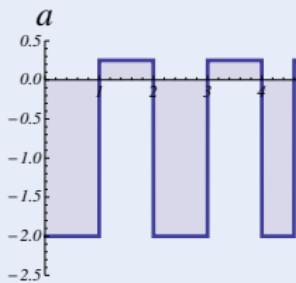
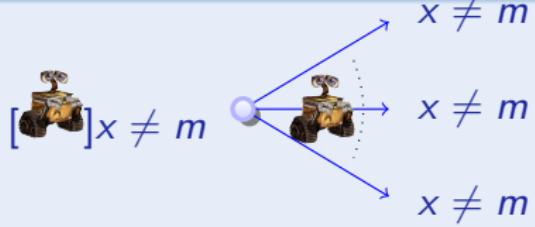
(JAR'08,LICS'12)



Concept (Differential Dynamic Logic)



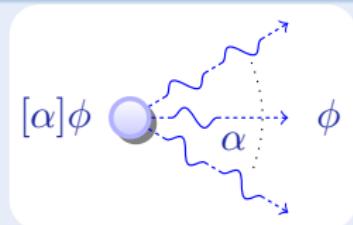
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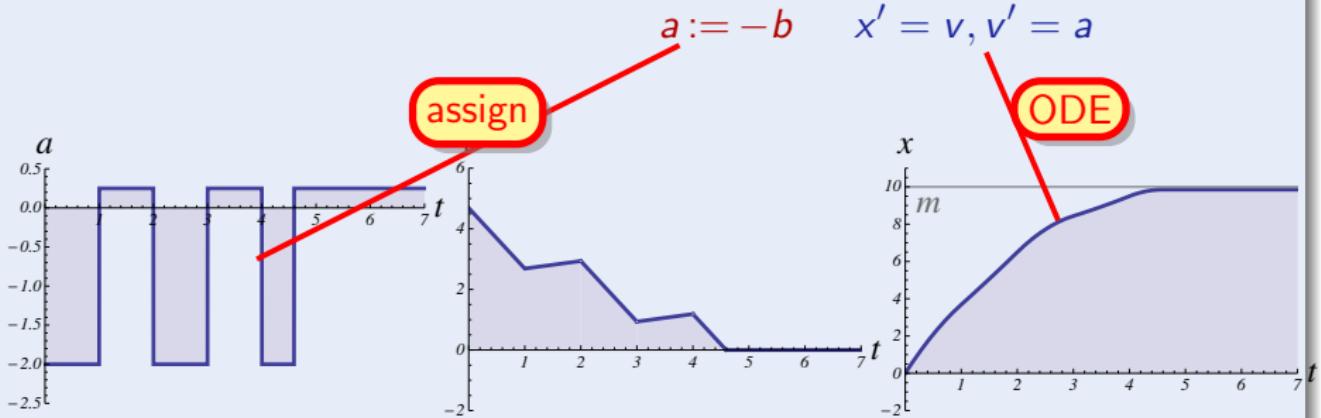
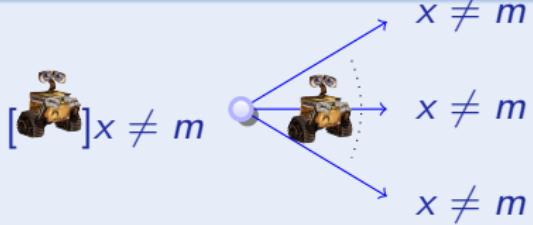
$$x' = v, v' = a$$

ODE

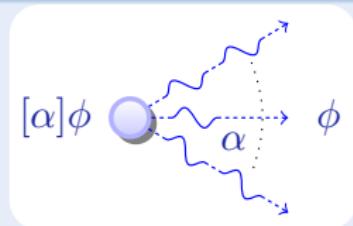
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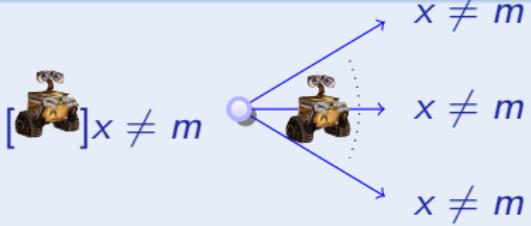
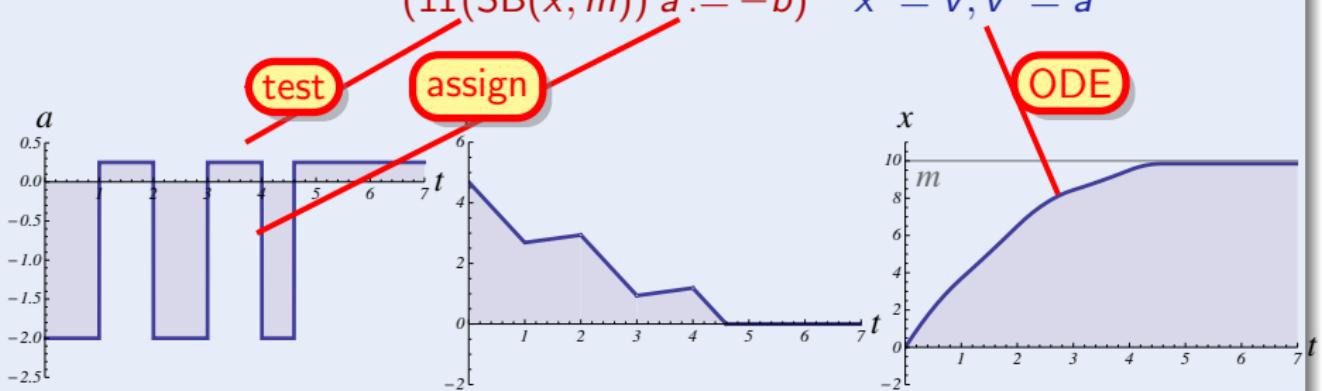
(JAR'08,LICS'12)



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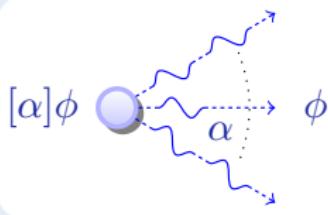


(JAR'08,LICS'12)


 $(\text{if}(\text{SB}(x, m)) \ a := -b) \quad x' = v, v' = a$


Concept (Differential Dynamic Logic)

(JAR'08,LICS'12)

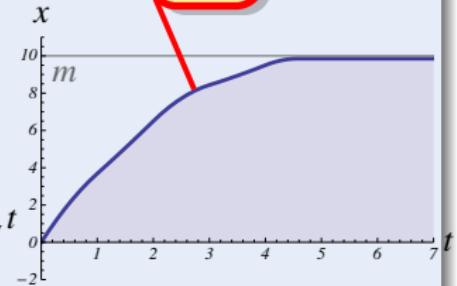
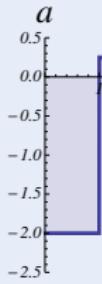


seq.
compose

(if(SB(x, m)) $a := -b$) ; $x' = v, v' = a$

test

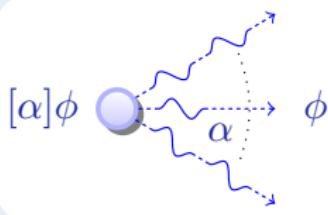
assign



ODE

Concept (Differential Dynamic Logic)

(JAR'08,LICS'12)



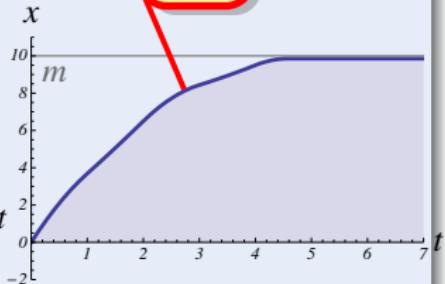
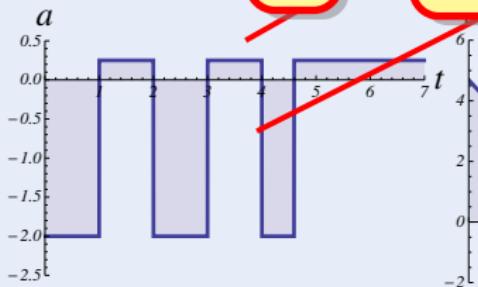
seq.
compose

nondet.
repeat

$$((\text{if}(\text{SB}(x, m)) a := -b) ; x' = v, v' = a)^*$$

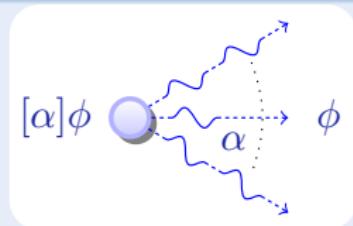
test

assign

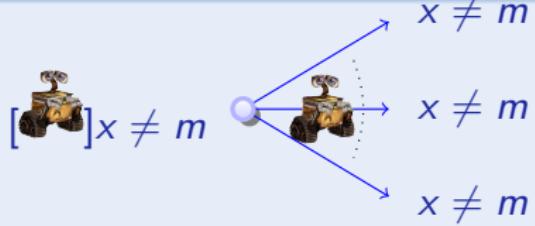


ODE

Concept (Differential Dynamic Logic)



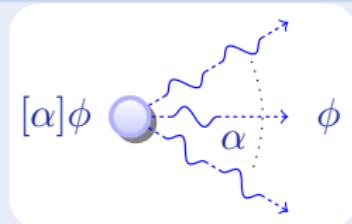
(JAR'08,LICS'12)



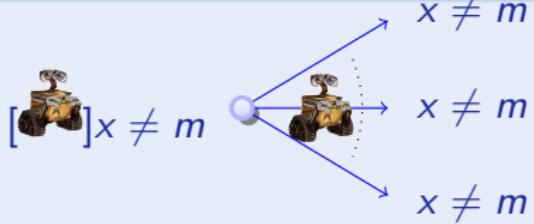
$$[((\text{if}(SB(x, m)) \ a := -b) ; \ x' = v, v' = a)^*]_{x \neq m} \text{ post}$$



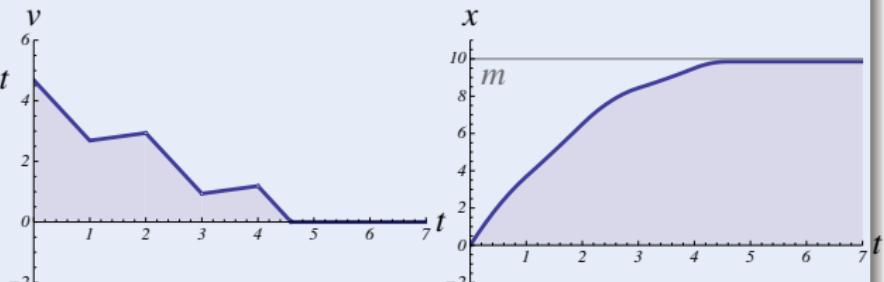
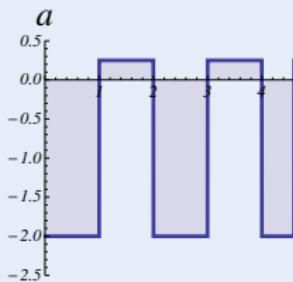
Concept (Differential Dynamic Logic)



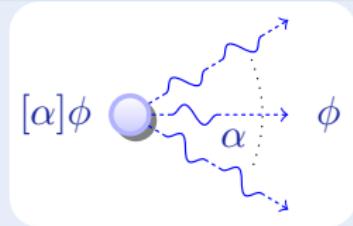
(JAR'08,LICS'12)



$$\underbrace{x \neq m \wedge b > 0}_{\text{init}} \rightarrow [((\text{if}(\text{SB}(x, m)) a := -b) ; x' = v, v' = a)^*] \underbrace{x \neq m}_{\text{post}}$$

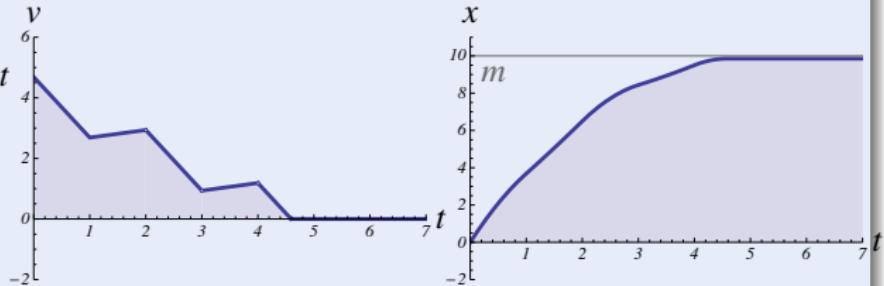
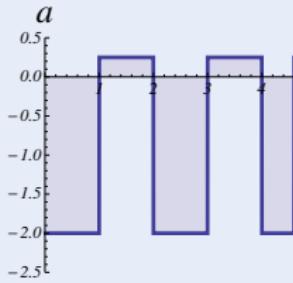
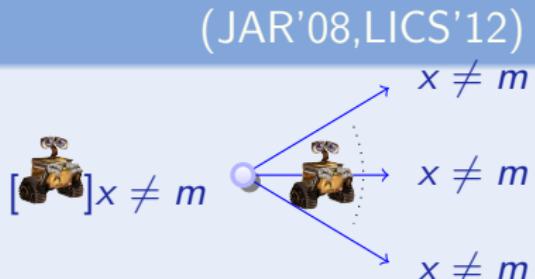


Concept (Differential Dynamic Logic)

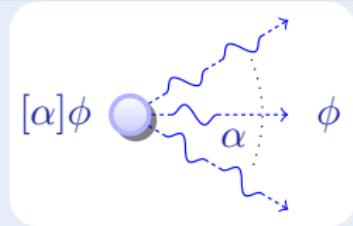


$$\underbrace{x \neq m \wedge b > 0}_{\text{init}} \rightarrow [((? \neg \text{SB}(x, m) \cup a := -b) ; x' = v, v' = a)^*] \underbrace{x \neq m}_{\text{post}}$$

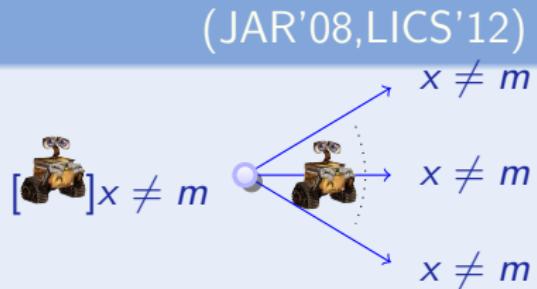
nondet.
choice



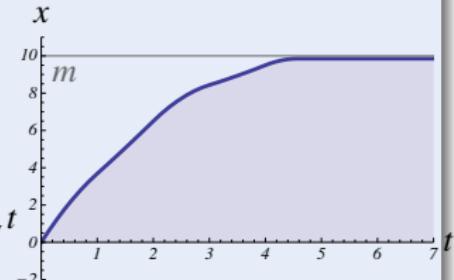
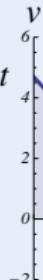
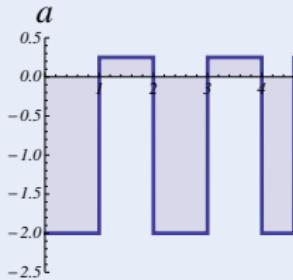
Concept (Differential Dynamic Logic)



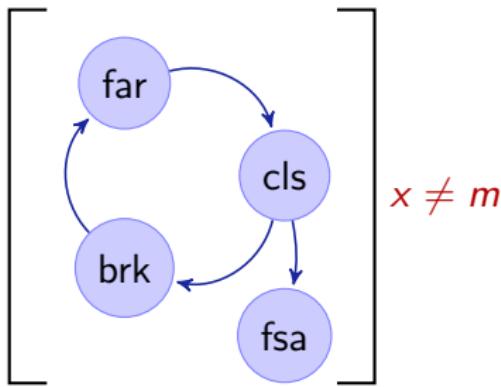
test nondet.
choice



$$\underbrace{x \neq m \wedge b > 0}_{\text{init}} \rightarrow [((? \neg \text{SB}(x, m) \cup a := -b) ; x' = v, v' = a)^*] \underbrace{x \neq m}_{\text{post}}$$



Want: Compositional verification



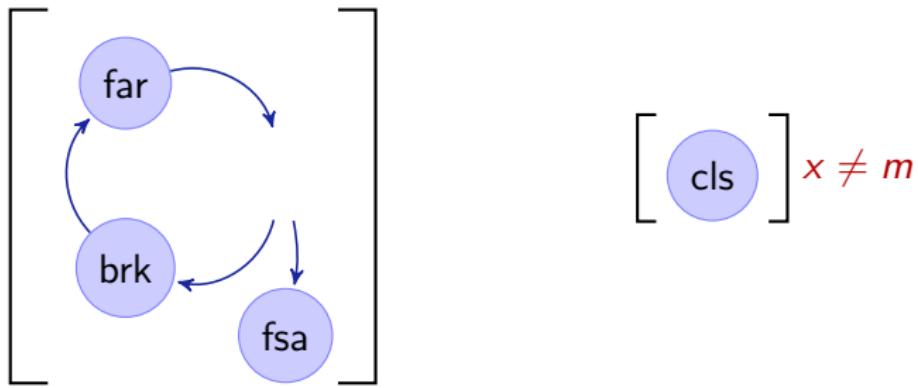
$$\text{far} \equiv x' = v, v' = A \& \neg \text{SB}(x, m)$$

$$\text{brk} \equiv x' = v, v' = -b \& \text{SB}(x, m) \vee \text{true}$$

$$\text{cls} \equiv x' = v, v' = \dots \& \dots$$

$$\text{fsa} \equiv x' = 0, v' = 0 \& v = 0$$

Want: Compositional verification



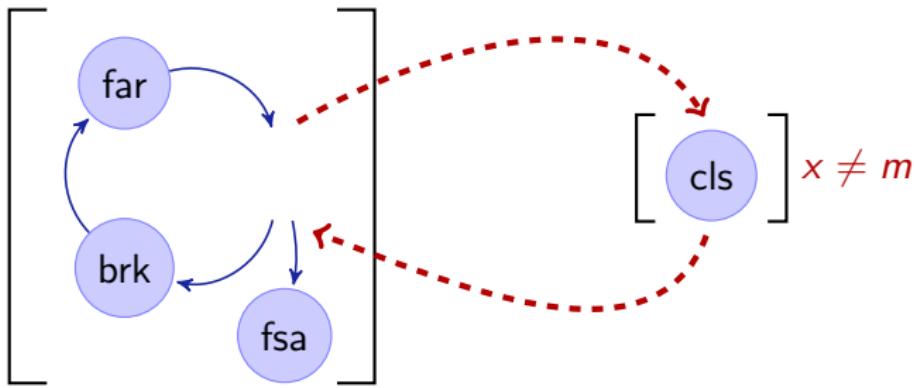
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Want: Compositional verification



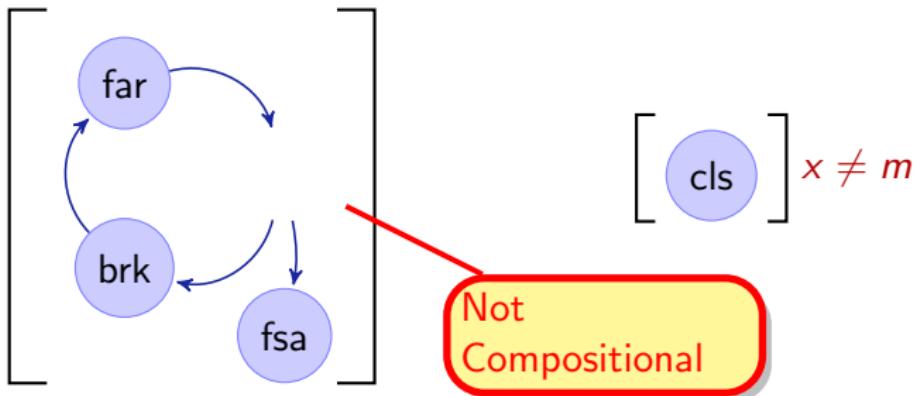
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$$\text{far} \equiv x' = v, v' = A \& \neg \text{SB}(x, m)$$

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$$\text{cls} \equiv x' = v, v' = \dots \& \dots$$

$$\text{fsa} \equiv x' = 0, v' = 0 \& v = 0$$

Definition (Hybrid program a)

$$x := f(x) \mid ?Q \mid x' = f(x) \& Q \mid a \cup b \mid a; b \mid a^*$$

Definition (dL Formula P)

$$e_1 \geq e_2 \mid \neg P \mid P \wedge Q \mid \forall x P \mid \exists x P \mid [a]P \mid \langle a \rangle P$$

Discrete
Assign

Test
Condition

Differential
Equation

Nondet.
Choice

Seq.
Compose

Nondet.
Repeat

Definition (Hybrid program a)

$$x := f(x) \mid ?Q \mid x' = f(x) \& Q \mid a \cup b \mid a; b \mid a^*$$

Definition (dL Formula P)

$$e_1 \geq e_2 \mid \neg P \mid P \wedge Q \mid \forall x P \mid \exists x P \mid [a]P \mid \langle a \rangle P$$

All
Reals

Some
Reals

All
Runs

Some
Runs

\mathcal{R} Differential Dynamic Logic dL: Semantics

Definition (Hybrid program semantics) $([\![\cdot]\!]: \text{HP} \rightarrow \wp(\mathcal{S} \times \mathcal{S}))$

$$[\![x := f(x)]\!] = \{(v, w) : w = v \text{ except } [\![x]\!]w = [\![f(x)]\!]v\}$$

$$[\![?Q]\!] = \{(v, v) : v \in [\![Q]\!]\}$$

$$[\![x' = f(x)]\!] = \{(\varphi(0), \varphi(r)) : \varphi \models x' = f(x) \text{ for some duration } r\}$$

$$[\![a \cup b]\!] = [\![a]\!] \cup [\![b]\!]$$

$$[\![a; b]\!] = [\![a]\!] \circ [\![b]\!]$$

$$[\![a^*]\!] = \bigcup_{n \in \mathbb{N}} [\![a^n]\!]$$

Definition (dL semantics) $([\![\cdot]\!]: \text{Fml} \rightarrow \wp(\mathcal{S}))$

$$[\![e_1 \geq e_2]\!] = \{v : [\![e_1]\!]v \geq [\![e_2]\!]v\}$$

$$[\![\neg P]\!] = ([\![P]\!])^\complement$$

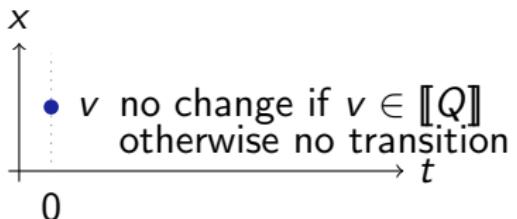
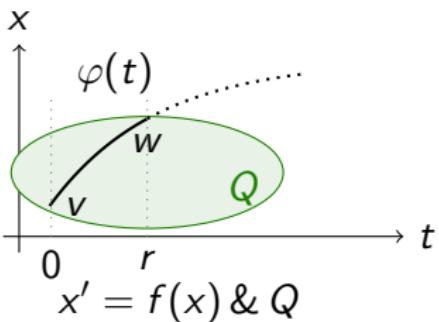
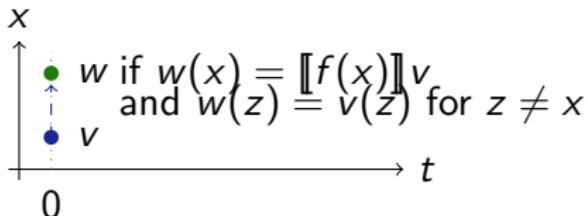
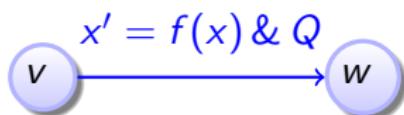
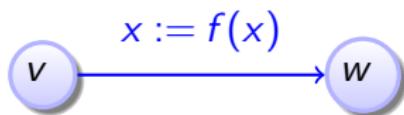
$$[\![P \wedge Q]\!] = [\![P]\!] \cap [\![Q]\!]$$

$$[\![\langle a \rangle P]\!] = [\![a]\!] \circ [\![P]\!] = \{v : w \in [\![P]\!] \text{ for some } w (v, w) \in [\![a]\!]\}$$

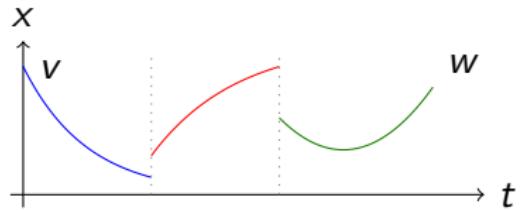
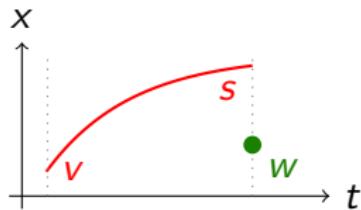
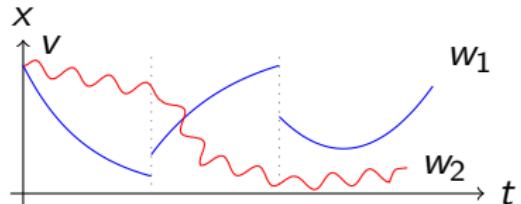
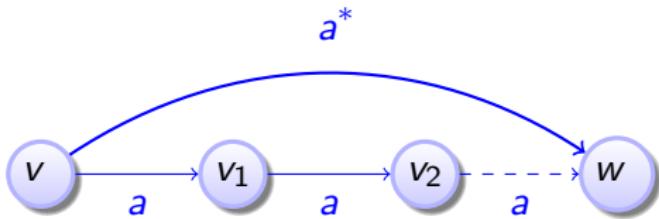
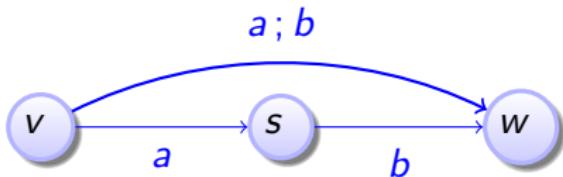
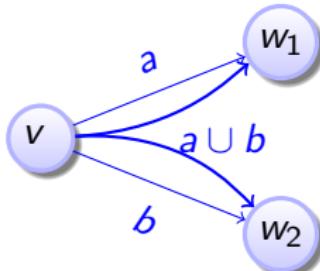
$$[\![\exists a P]\!] = [\![\neg \langle a \rangle \neg P]\!] = \{v : w \in [\![P]\!] \text{ for all } w (v, w) \in [\![a]\!]\}$$

$$[\![\exists x P]\!] = \{v : v_x^r \in [\![P]\!] \text{ for some } r \in \mathbb{R}\}$$

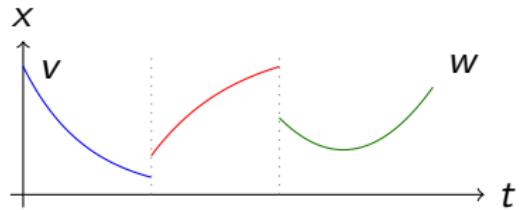
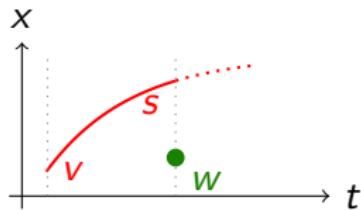
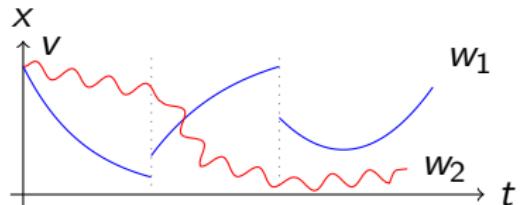
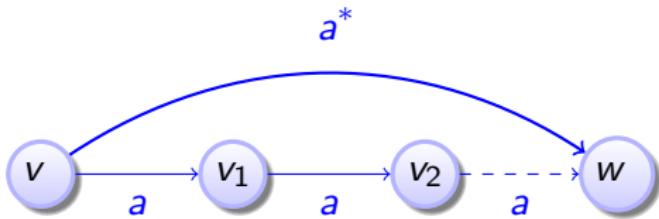
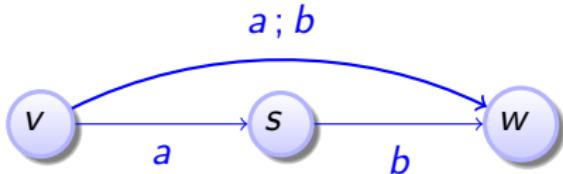
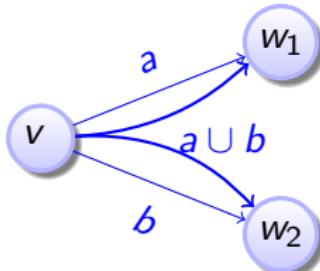
\mathcal{R} Differential Dynamic Logic dL: Transition Semantics



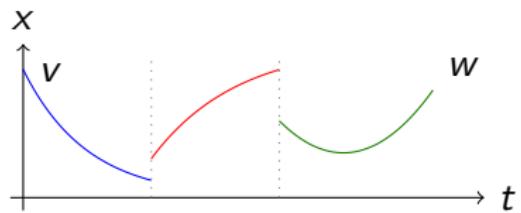
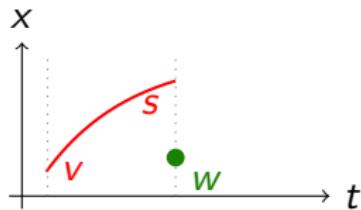
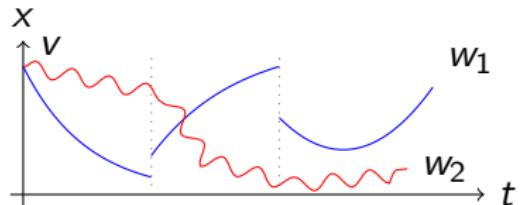
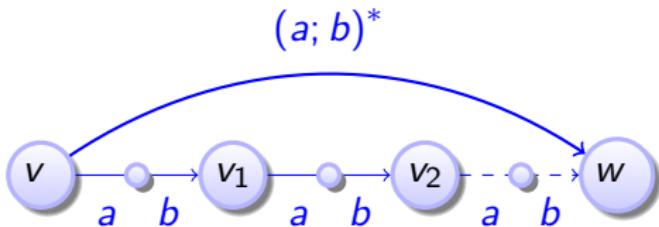
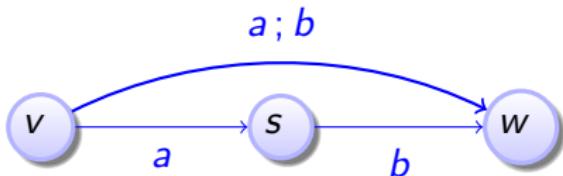
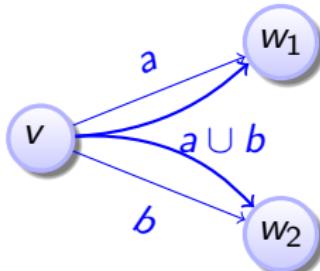
\mathcal{R} Differential Dynamic Logic dL: Transition Semantics

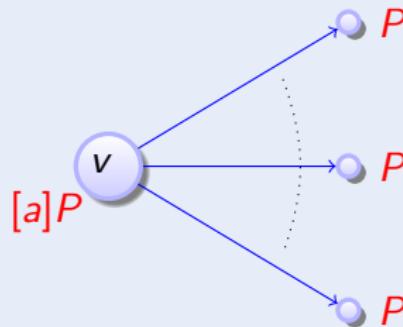


\mathcal{R} Differential Dynamic Logic dL: Transition Semantics

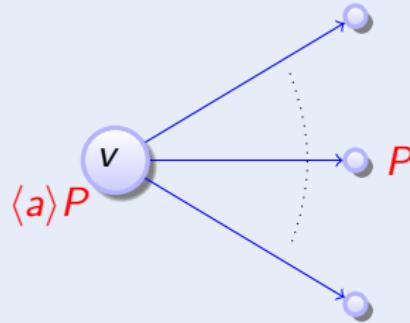


\mathcal{R} Differential Dynamic Logic dL: Transition Semantics

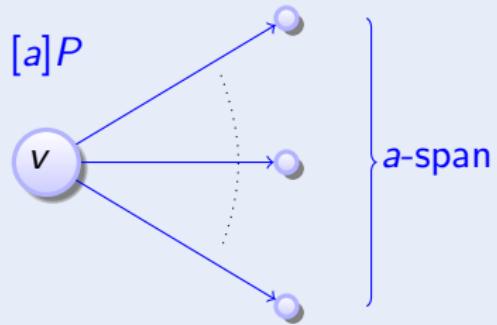


Definition ($d\mathcal{L}$ Formulas)

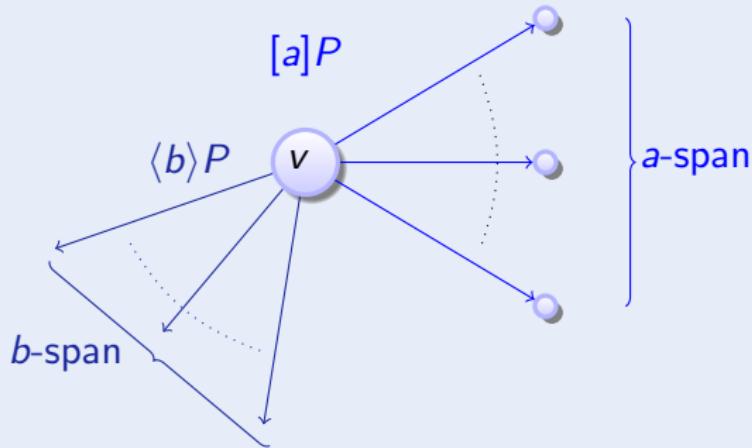
Definition (dL Formulas)



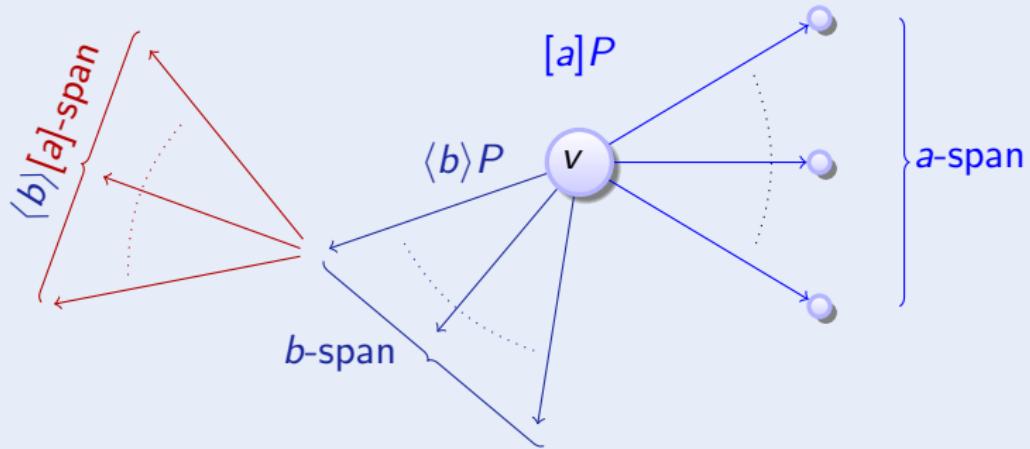
Definition (dL Formulas)

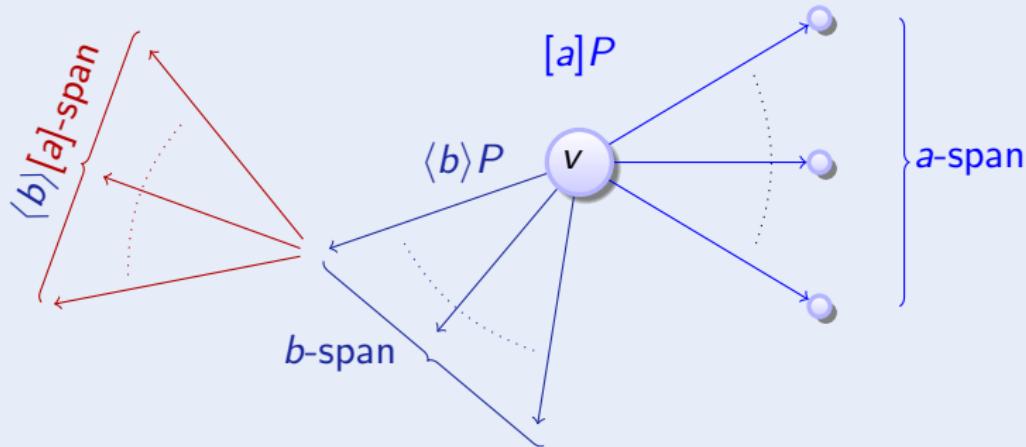


Definition (dL Formulas)



Definition (dL Formulas)



Definition ($d\mathcal{L}$ Formulas)

compositional semantics \Rightarrow compositional proofs!

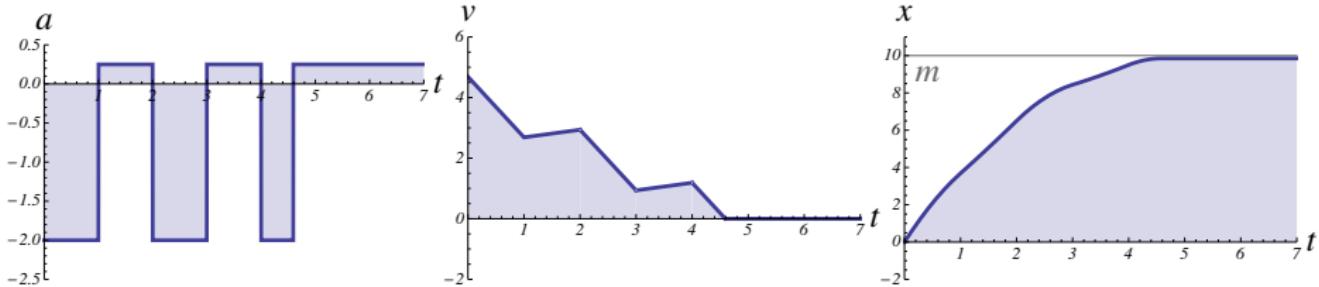
\mathcal{R} Ex: Car Control

Accelerate condition $?H$



Example (Single car car_s)

$$(((?H; a := A) \cup a := -b); \quad x' = v, v' = a \& v \geq 0)^*$$



$$H \equiv 2b(m - x) \geq v^2 + (A + b)(A\varepsilon^2 + 2\varepsilon v)$$

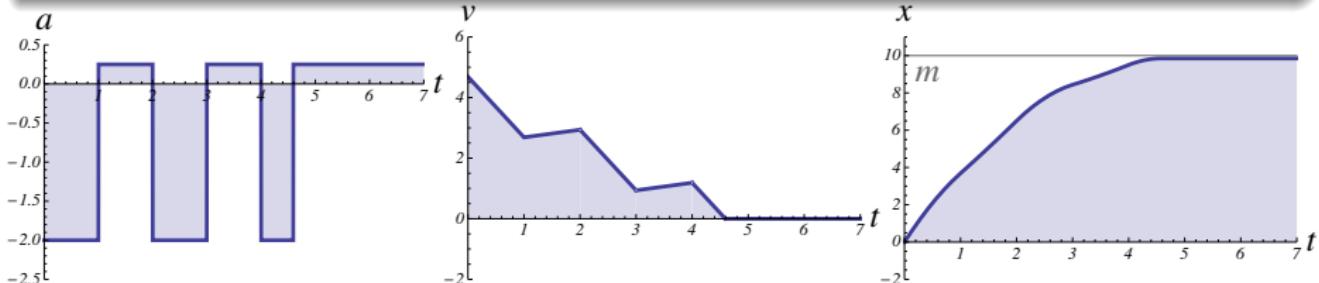


Example (Single car car_ε time-triggered)

$$(((?H; a := A) \cup a := -b); \quad t := 0; \quad x' = v, v' = a, t' = 1 \& v \geq 0 \wedge t \leq \varepsilon)^*$$

Example (➡ Safely stays before traffic light m)

$$v^2 \leq 2b(m - x) \wedge A \geq 0 \wedge b > 0 \rightarrow [car_\varepsilon]x \leq m$$



$$H \equiv 2b(m - x) \geq v^2 + (A + b)(A\varepsilon^2 + 2\varepsilon v)$$

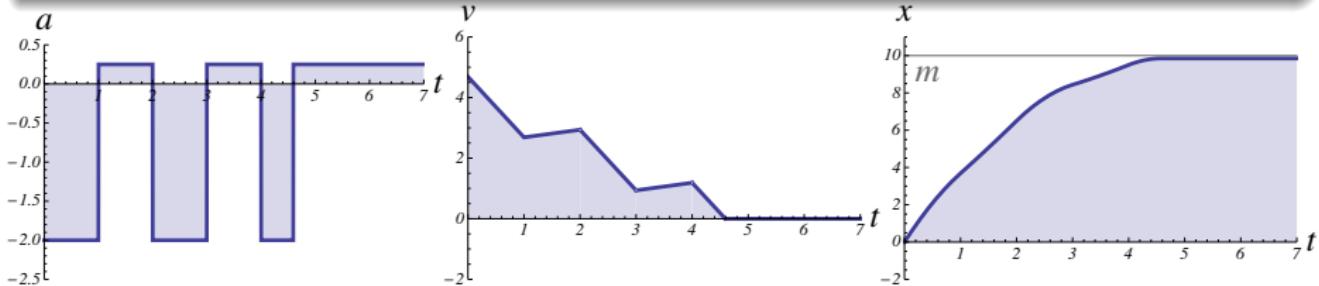


Example (Single car car_ε time-triggered)

$$(((?H; a := A) \cup a := -b); \quad t := 0; \quad x' = v, v' = a, t' = 1 \& v \geq 0 \wedge t \leq \varepsilon)^*$$

Example (Live, can move everywhere)

$$\varepsilon > 0 \wedge A > 0 \wedge b > 0 \rightarrow \forall p \exists m \langle car_\varepsilon \rangle x \geq p$$



1 CPS are Multi-Dynamical Systems

- Hybrid Systems
- Hybrid Games

2 Dynamic Logic of Dynamical Systems

- Syntax
- Semantics
- Example: Car Control Design

3 Proofs for CPS

- Compositional Proof Calculus
- Example: Safe Car Control

4 Theory of CPS

- Soundness and Completeness
- Differential Invariants
- Example: Elementary Differential Invariants
- Differential Axioms

5 Applications

6 Summary

Differential Dynamic Logic: Axioms

$$[:=] \quad [x := f]p(x) \leftrightarrow p(f)$$

$$[?] \quad [?q]p \leftrightarrow (q \rightarrow p)$$

$$[\cup] \quad [a \cup b]p(x) \leftrightarrow [a]p(x) \wedge [b]p(x)$$

$$[:] \quad [a; b]p(x) \leftrightarrow [a][b]p(x)$$

$$[*] \quad [a^*]p(x) \leftrightarrow p(x) \wedge [a][a^*]p(x)$$

$$\mathsf{K} \quad [a](p(x) \rightarrow q(x)) \rightarrow ([a]p(x) \rightarrow [a]q(x))$$

$$\mathsf{I} \quad [a^*](p(x) \rightarrow [a]p(x)) \rightarrow (p(x) \rightarrow [a^*]p(x))$$

$$\mathsf{V} \quad p \rightarrow [a]p$$

$$\mathsf{DS} \quad [x' = f]p(x) \leftrightarrow \forall t \geq 0 [x := x + ft]p(x)$$

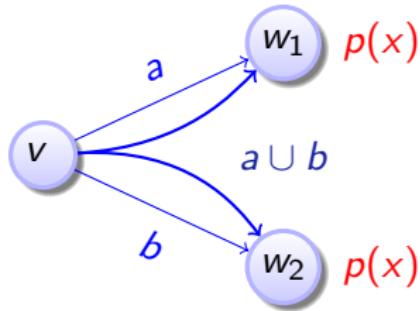
LICS'12, CADE'15

Proofs for Hybrid Systems

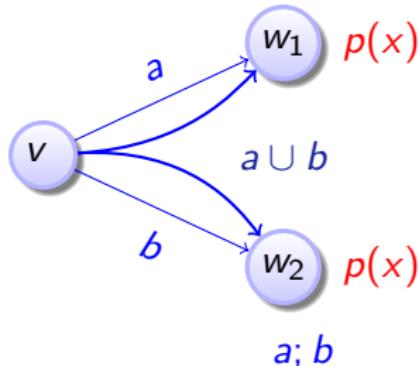
compositional semantics \Rightarrow compositional rules!

\mathcal{P} Proofs for Hybrid Systems

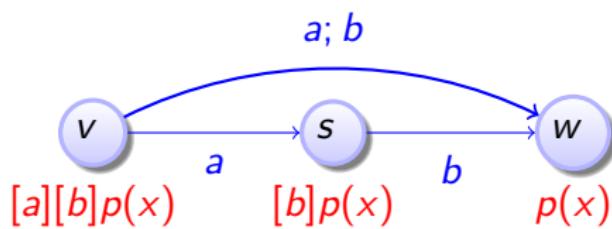
$$\frac{[a]p(x) \wedge [b]p(x)}{[a \cup b]p(x)}$$



$$\frac{[a]p(x) \wedge [b]p(x)}{[a \cup b]p(x)}$$

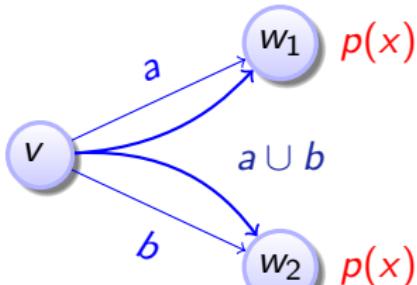


$$\frac{[a][b]p(x)}{[a; b]p(x)}$$

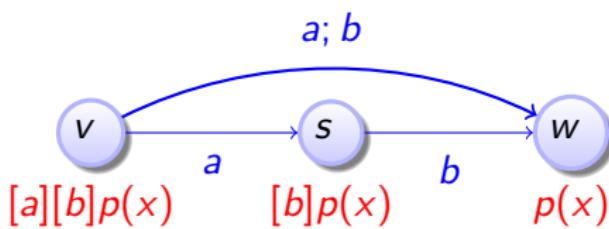


\mathcal{P} Proofs for Hybrid Systems

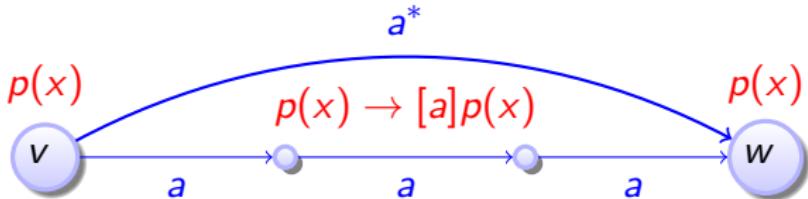
$$\frac{[a]p(x) \wedge [b]p(x)}{[a \cup b]p(x)}$$



$$\frac{[a][b]p(x)}{[a; b]p(x)}$$



$$\frac{p(x) \quad p(x) \rightarrow [a]p(x)}{[a^*]p(x)}$$



Example Proof: Safe Driving



$$J(x, v) \equiv x \leq m$$



$$[;] \overline{J(x, v) \rightarrow [a := -b; (x' = v, v' = a)] J(x, v)}$$

\mathcal{R} Example Proof: Safe Driving



$$J(x, v) \equiv x \leq m$$



$$\frac{[:=] J(x, v) \rightarrow [a := -b][x' = v, v' = a]J(x, v)}{[:] J(x, v) \rightarrow [a := -b; (x' = v, v' = a)]J(x, v)}$$

Example Proof: Safe Driving



$$J(x, v) \equiv x \leq m$$



$$\frac{['] J(x, v) \rightarrow [x' = v, v' = -b] J(x, v)}{[:=] J(x, v) \rightarrow [a := -b][x' = v, v' = a] J(x, v)}$$
$$\frac{[:] J(x, v) \rightarrow [a := -b; (x' = v, v' = a)] J(x, v)}{\quad}$$

Example Proof: Safe Driving



$$J(x, v) \equiv x \leq m$$



$$\begin{array}{c} [=] J(x, v) \rightarrow \forall t \geq 0 [x := -\frac{b}{2}t^2 + vt + x] J(x, v) \\ [=] J(x, v) \rightarrow [x' = v, v' = -b] J(x, v) \\ [=] J(x, v) \rightarrow [a := -b] [x' = v, v' = a] J(x, v) \\ [:] J(x, v) \rightarrow [a := -b; (x' = v, v' = a)] J(x, v) \end{array}$$

Example Proof: Safe Driving



$$J(x, v) \equiv x \leq m$$



$$\frac{\text{QE } J(x, v) \rightarrow \forall t \geq 0 (-\frac{b}{2}t^2 + vt + x \leq m)}{[:=] J(x, v) \rightarrow \forall t \geq 0 [x := -\frac{b}{2}t^2 + vt + x] J(x, v)}$$
$$\frac{['] J(x, v) \rightarrow [x' = v, v' = -b] J(x, v)}{[:=] J(x, v) \rightarrow [a := -b] [x' = v, v' = a] J(x, v)}$$
$$\frac{[:] J(x, v) \rightarrow [a := -b; (x' = v, v' = a)] J(x, v)}{}$$

Example Proof: Safe Driving



$$J(x, v) \equiv x \leq m$$

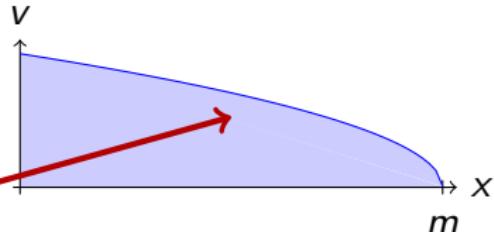


$$\frac{J(x, v) \rightarrow v^2 \leq 2b(m - x)}{\text{QE } J(x, v) \rightarrow \forall t \geq 0 \left(-\frac{b}{2}t^2 + vt + x \leq m \right)}$$
$$\frac{[:=] J(x, v) \rightarrow \forall t \geq 0 [x := -\frac{b}{2}t^2 + vt + x] J(x, v)}{[:] J(x, v) \rightarrow [x' = v, v' = -b] J(x, v)}$$
$$\frac{[:=] J(x, v) \rightarrow [a := -b] [x' = v, v' = a] J(x, v)}{[:] J(x, v) \rightarrow [a := -b; (x' = v, v' = a)] J(x, v)}$$

\mathcal{R} Example Proof: Safe Driving



$$J(x, v) \equiv v^2 \leq 2b(m - x)$$

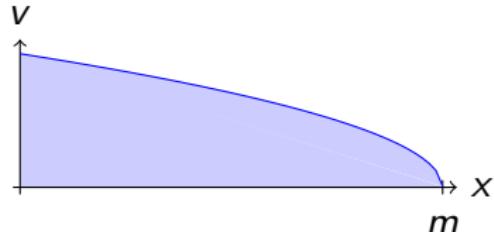


$$\frac{J(x, v) \rightarrow v^2 \leq 2b(m - x)}{\text{QE } J(x, v) \rightarrow \forall t \geq 0 \left(-\frac{b}{2}t^2 + vt + x \leq m \right)}$$
$$\frac{[:=] J(x, v) \rightarrow \forall t \geq 0 [x := -\frac{b}{2}t^2 + vt + x] J(x, v)}{['] J(x, v) \rightarrow [x' = v, v' = -b] J(x, v)}$$
$$\frac{[:=] J(x, v) \rightarrow [a := -b] [x' = v, v' = a] J(x, v)}{[:] J(x, v) \rightarrow [a := -b; (x' = v, v' = a)] J(x, v)}$$

Example Proof: Safe Driving



$$J(x, v) \equiv v^2 \leq 2b(m - x)$$



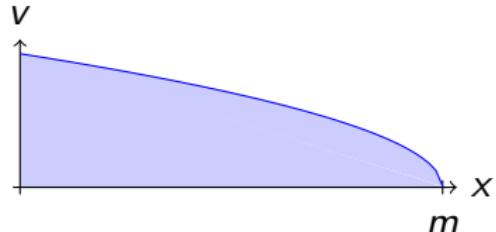
$$\vdash \overline{J(x, v) \rightarrow [\text{?} \neg \text{SB}; a := A; (x' = v, v' = a, t' = 1 \& t \leq \varepsilon)] J(x, v)}$$

CADE'15

\mathcal{R} Example Proof: Safe Driving



$$J(x, v) \equiv v^2 \leq 2b(m - x)$$



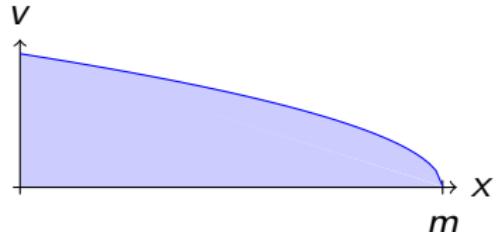
$$\frac{[?] \ J(x, v) \rightarrow [? \neg SB][a := A; (x' = v, v' = a, t' = 1 \ \& \ t \leq \varepsilon)]J(x, v)}{[:] \ J(x, v) \rightarrow [? \neg SB; a := A; (x' = v, v' = a, t' = 1 \ \& \ t \leq \varepsilon)]J(x, v)}$$

CADE'15

Example Proof: Safe Driving



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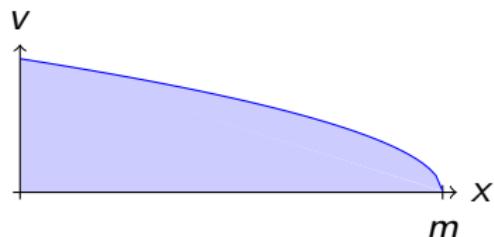
-
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CADE'15

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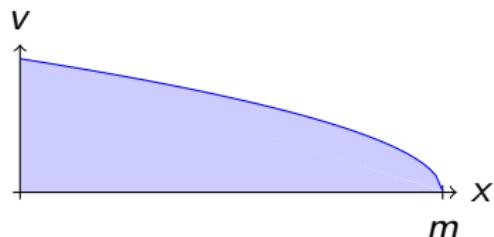


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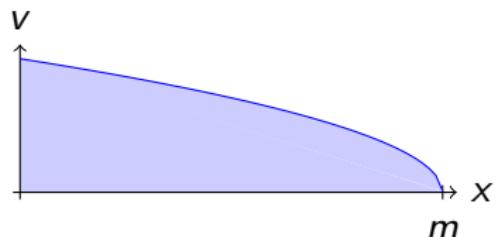
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CADE'15

R Example Proof: Safe Driving



$$J(x, v) \equiv v^2 \leq 2b(m - x)$$



$$[:=] J(x, v) \rightarrow \neg SB \rightarrow \forall t \geq 0 (t \leq \varepsilon \rightarrow [x := \frac{A}{2}t^2 + vt + x] J(x, v))$$

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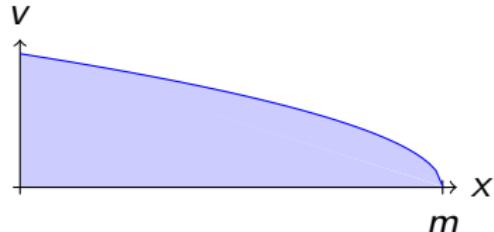
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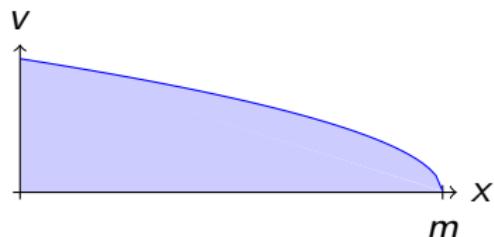


	$J(x, v) \rightarrow \neg \text{SB} \rightarrow \forall t \geq 0 (t \leq \varepsilon \rightarrow J(\frac{A}{2}t^2 + vt + x, At + v))$
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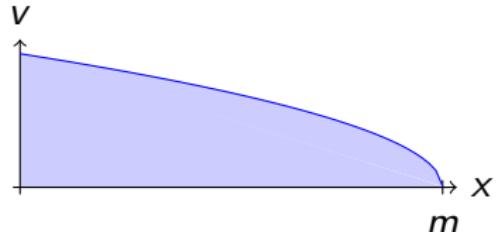


QE	$J(x, v) \rightarrow \neg SB \rightarrow \forall t \geq 0 (t \leq \varepsilon \rightarrow (At + v)^2 \leq 2b(m - \frac{A}{2}t^2 - vt - x))$
	$J(x, v) \rightarrow \neg SB \rightarrow \forall t \geq 0 (t \leq \varepsilon \rightarrow J(\frac{A}{2}t^2 + vt + x, At + v))$
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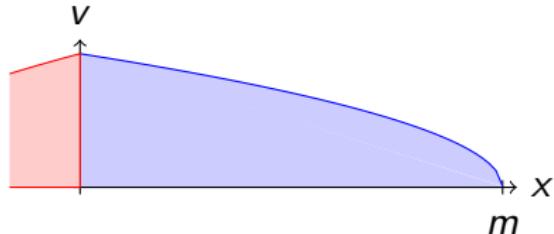
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Example Proof: Safe Driving



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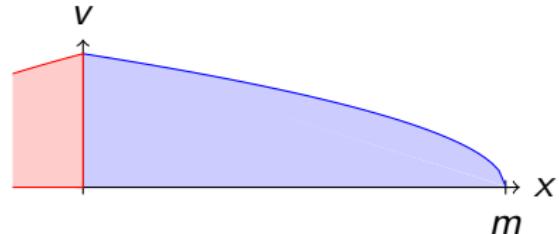
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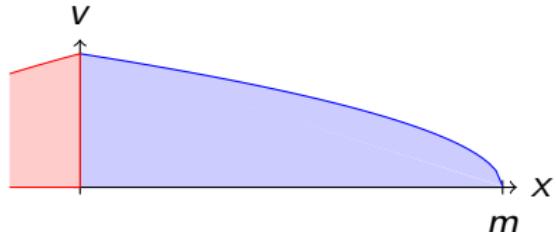
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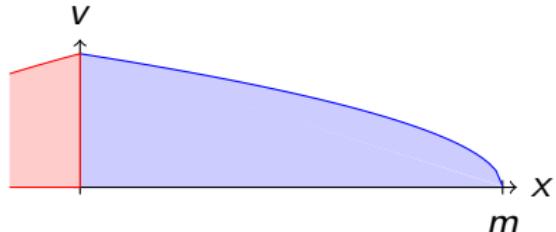
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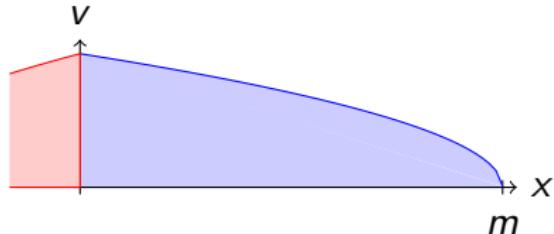
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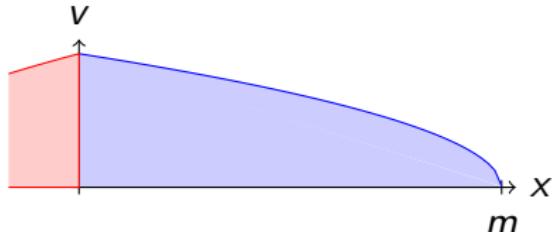
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previous proofs for braking and acceleration

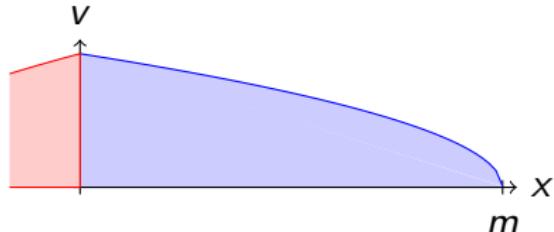
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- ① Proof is essentially deterministic “follow your nose”
- ② Synthesize invariant $J(,)$ and parameter constraint SB
- ③ $J(x, v)$ is a predicate symbol to prove only once and instantiate later

- 1 CPS are Multi-Dynamical Systems
 - Hybrid Systems
 - Hybrid Games
- 2 Dynamic Logic of Dynamical Systems
 - Syntax
 - Semantics
 - Example: Car Control Design
- 3 Proofs for CPS
 - Compositional Proof Calculus
 - Example: Safe Car Control
- 4 Theory of CPS
 - Soundness and Completeness
 - Differential Invariants
 - Example: Elementary Differential Invariants
 - Differential Axioms
- 5 Applications
- 6 Summary

Complete Proof Theory of Hybrid Systems

Theorem (Sound & Complete) (J.Autom.Reas. 2008, LICS'12)

dL calculus is a sound & complete axiomatization of hybrid systems relative to either differential equations or discrete dynamics.

► Proof 25pp

Corollary (Complete Proof-theoretical Alignment & Bridging)
proving continuous = proving hybrid = proving discrete

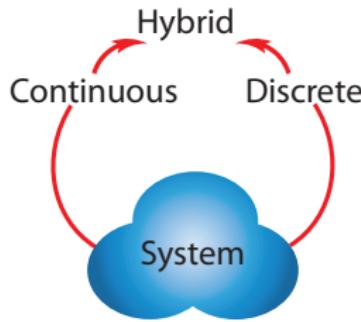
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JAutomReas'08, LICS'12

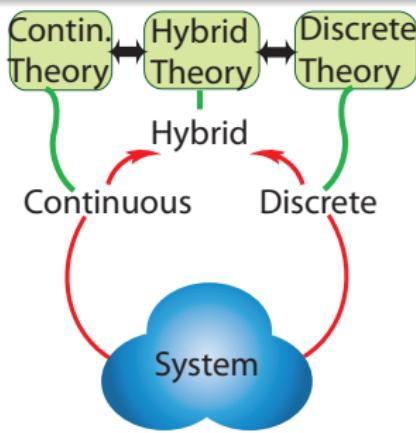
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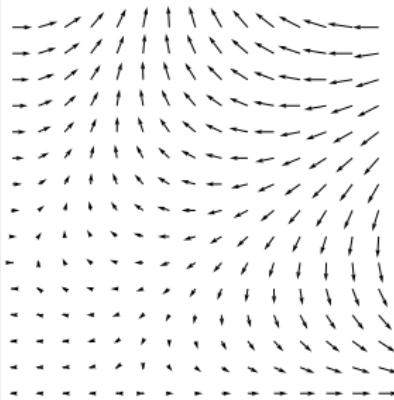
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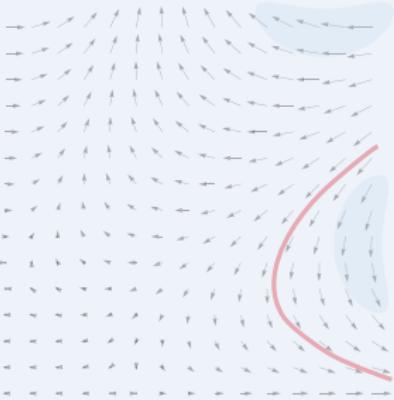


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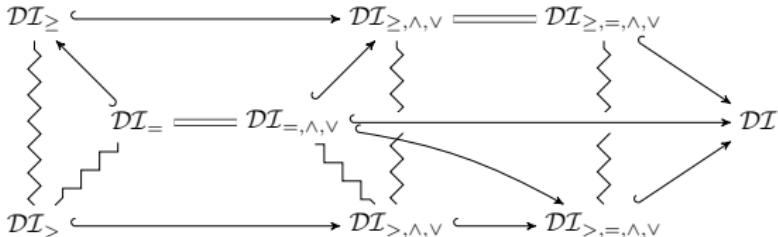
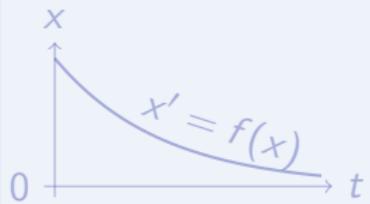
Differential Invariant



Differential Cut



Differential Ghost

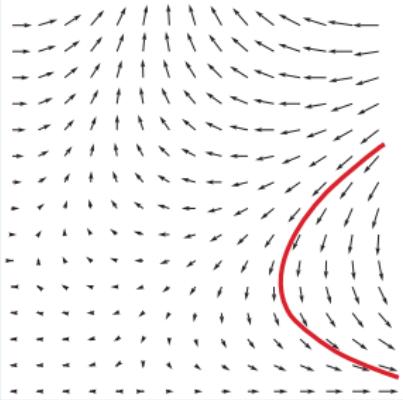


Logic
Probability
theory

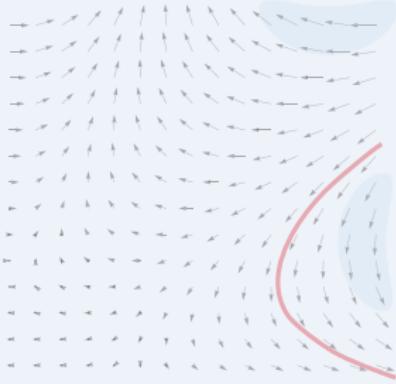
Math
Characteristic PDE

JLogComput'10, CAV'08, FMSD'09, LMCS'12, ITP'12

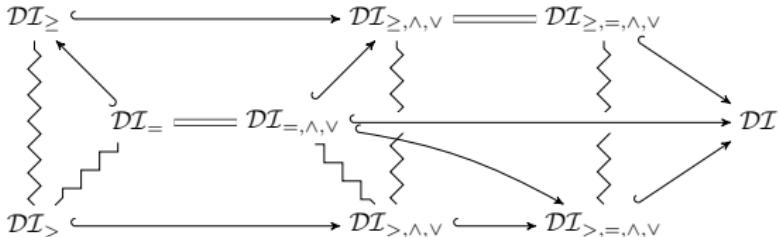
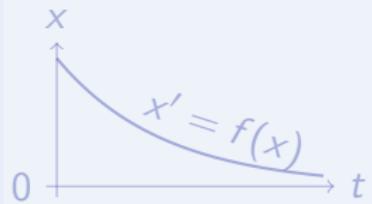
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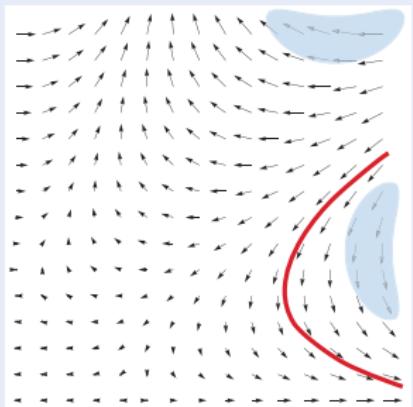


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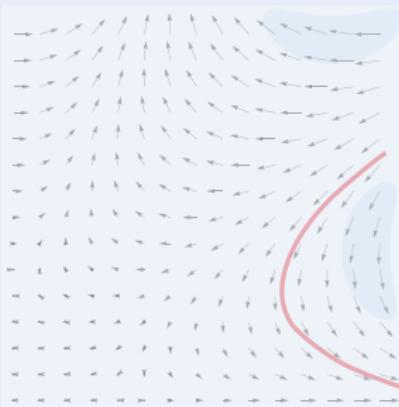
Logic
Probability
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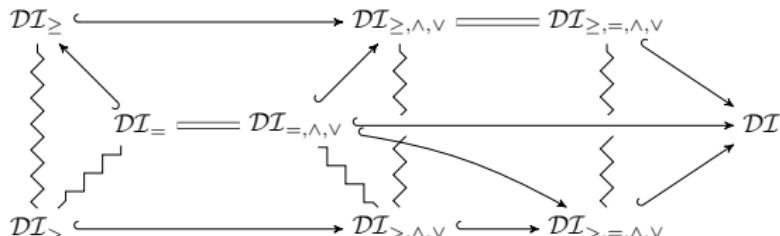
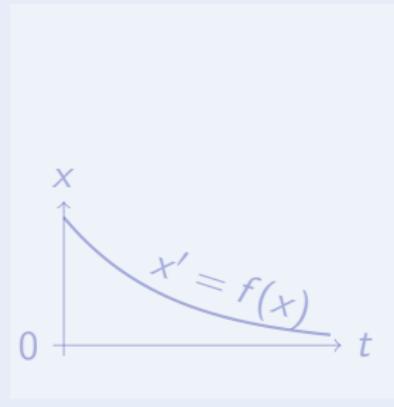
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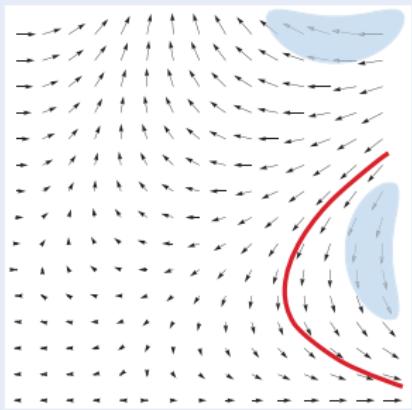


Logic
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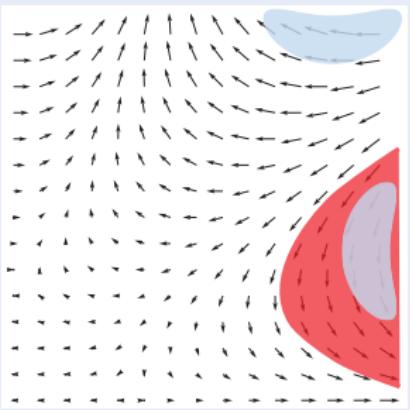
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Characteristic PDE

JLogComput'10, CAV'08, FMSD'09, LMCS'12, ITP'12

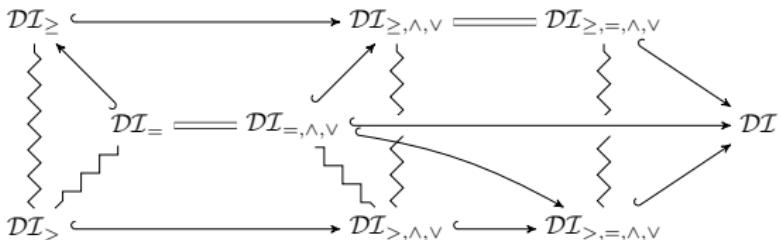
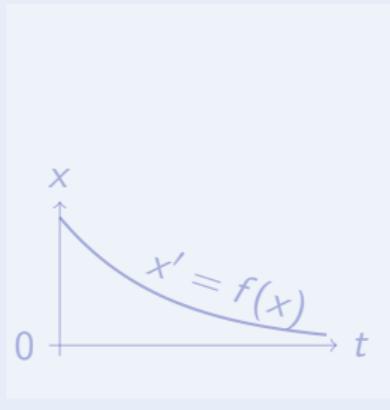
Differential Invariant



Differential Cut



Differential Ghost

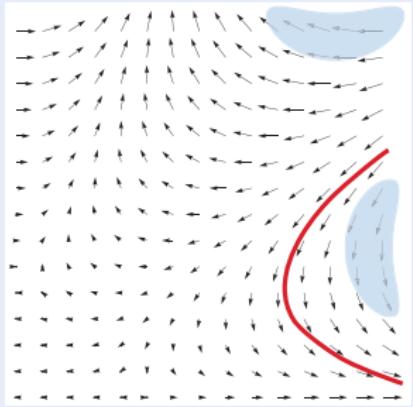


Logic
Probability theory

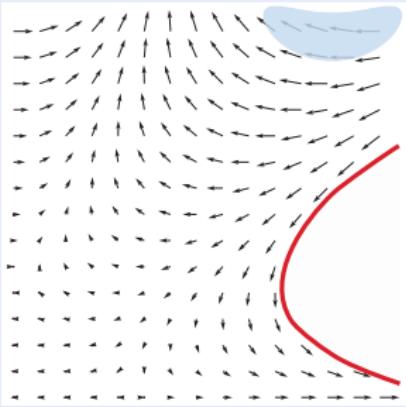
Math
Characteristic PDE

JLogComput'10, CAV'08, FMSD'09, LMCS'12, ITP'12

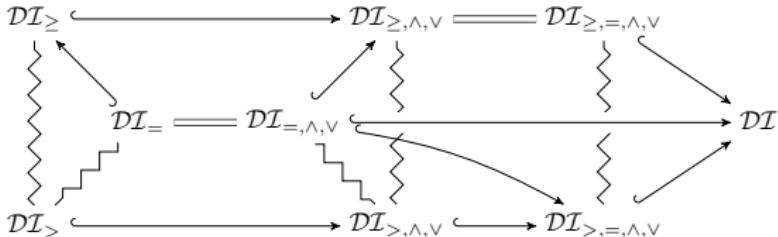
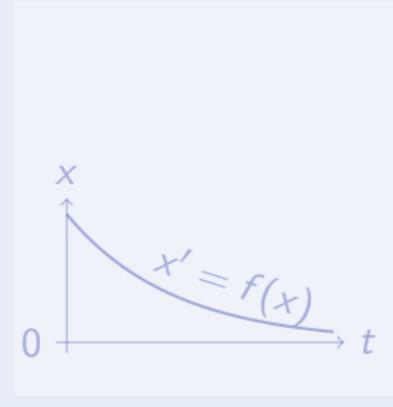
Differential Invariant



Differential Cut



Differential Ghost

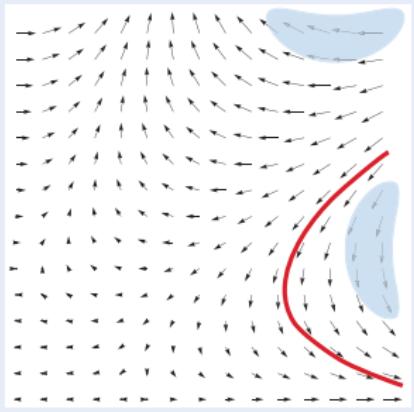


Logic
Probability theory

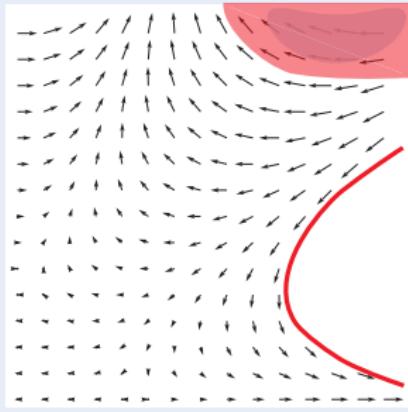
Math
Characteristic PDE

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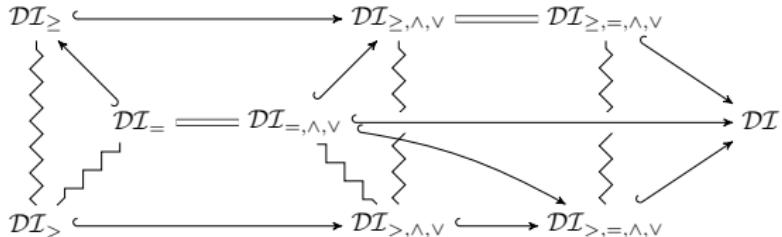
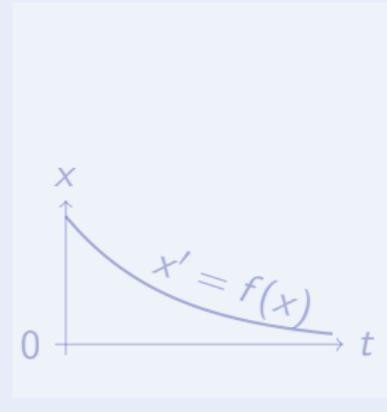
Differential Invariant



Differential Cut



Differential Ghost

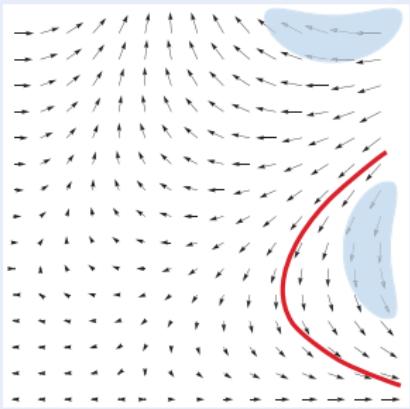


Logic
Provability
theory

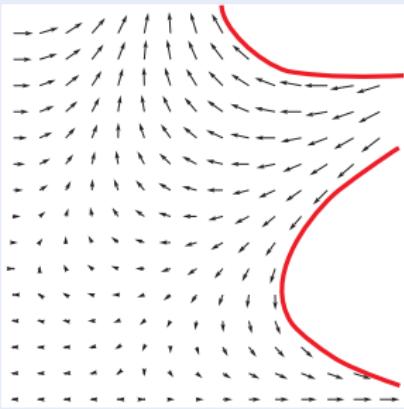
Math
Characteristic PDE

JLogComput'10, CAV'08, FMSD'09, LMCS'12, ITP'12

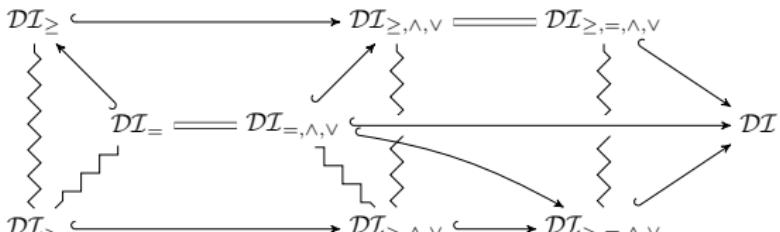
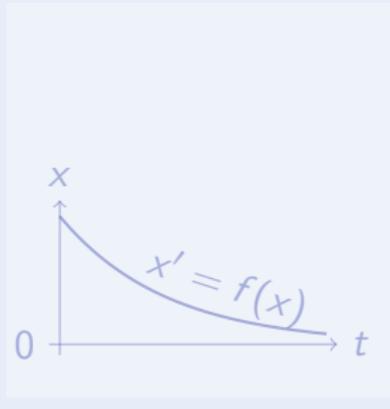
Differential Invariant



Differential Cut



Differential Ghost

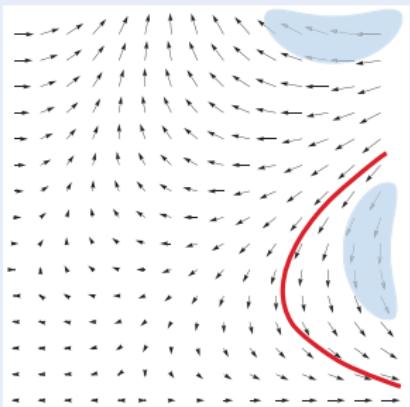


Logic
Probability
theory

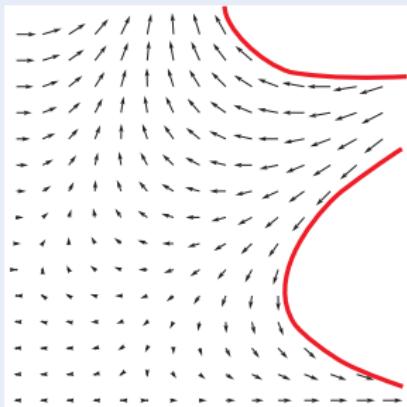
Math
Characteristic PDE

JLogComput'10, CAV'08, FMSD'09, LMCS'12, ITP'12

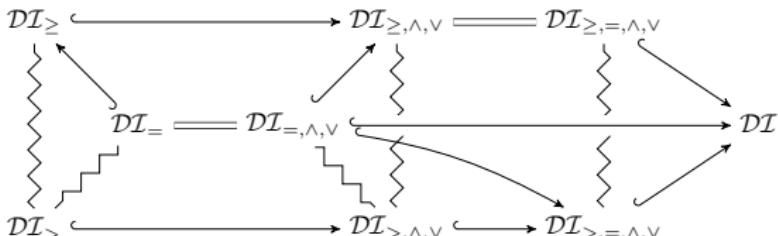
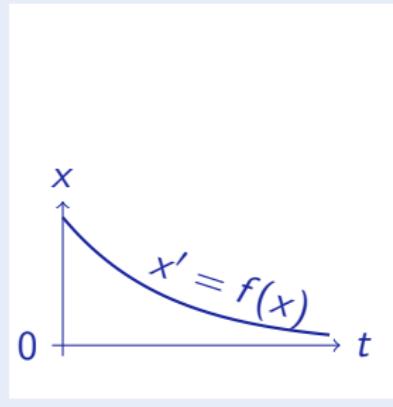
Differential Invariant



Differential Cut



Differential Ghost

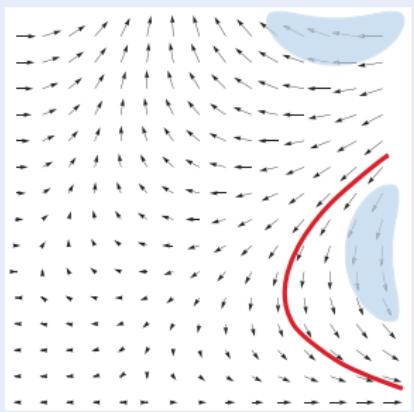


Logic
Probability
theory

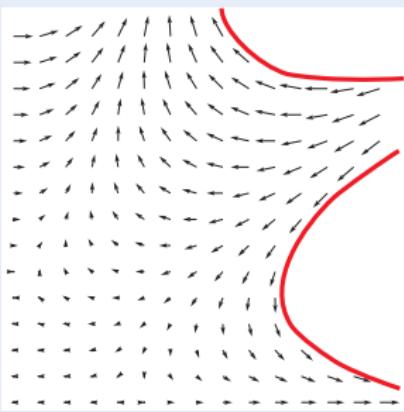
Math
Characteristic PDE

JLogComput'10, CAV'08, FMSD'09, LMCS'12, ITP'12

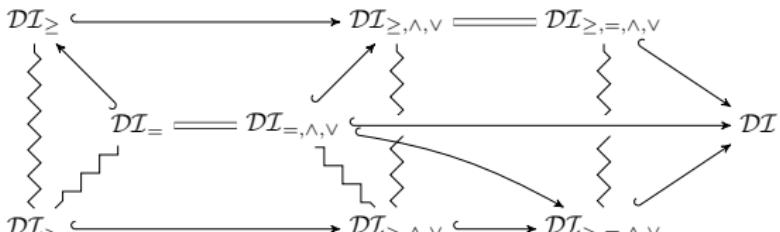
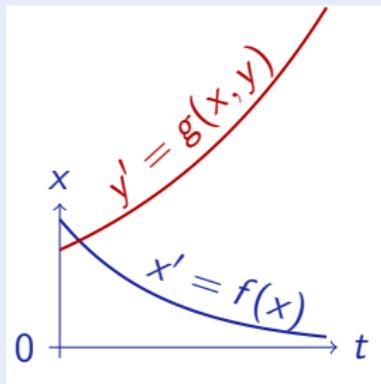
Differential Invariant



Differential Cut



Differential Ghost

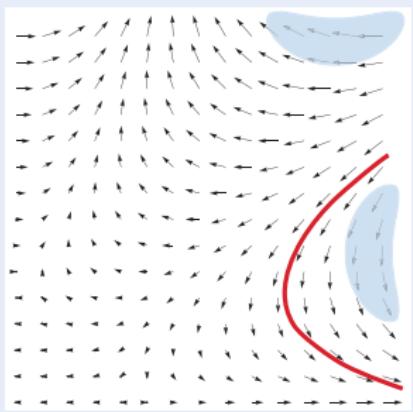


Logic
Probability
theory

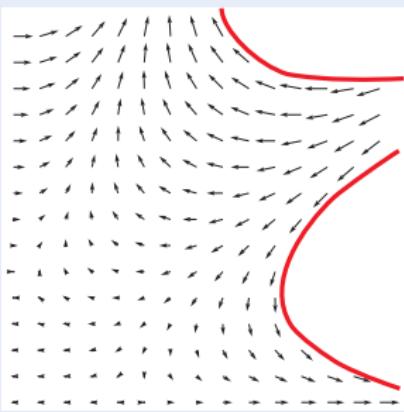
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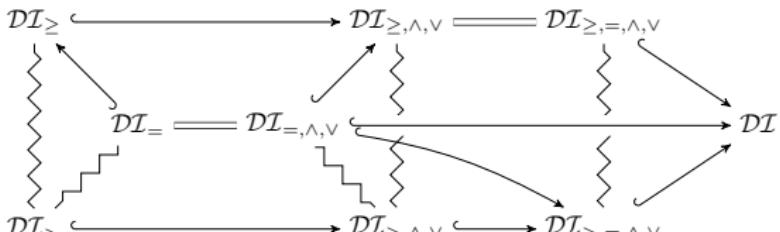
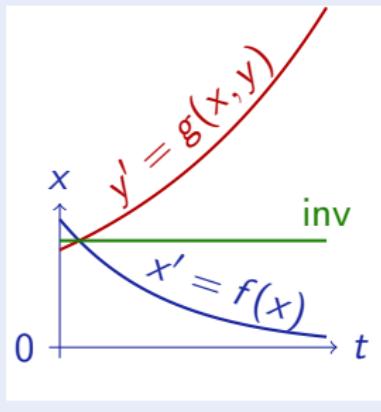
Differential Invariant



Differential Cut



Differential Ghost



Logic
Probability
theory

Math
Characteristic PDE

JLogComput'10, CAV'08, FMSD'09, LMCS'12, ITP'12

Differential Invariant

$$\frac{H \rightarrow [x' := f(x)]F'}{F \rightarrow [x' = f(x) \& H]F}$$

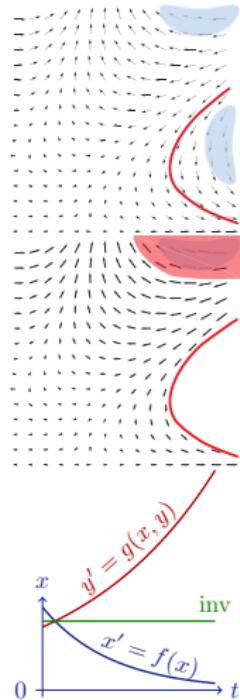
Differential Cut

$$\frac{F \rightarrow [x' = f(x)]C \quad F \rightarrow [x' = f(x) \& C]F}{F \rightarrow [x' = f(x)]F}$$

Differential Ghost

$$\frac{F \leftrightarrow \exists y \ G \quad G \rightarrow [x' = f(x), y' = g(x, y) \& H]G}{F \rightarrow [x' = f(x) \& H]F}$$

if new $y' = g(x, y)$ has a global solution



Differential Invariant

$$\frac{H \rightarrow [x' := f(x)]F'}{F \rightarrow [x' = f(x) \& H]F}$$

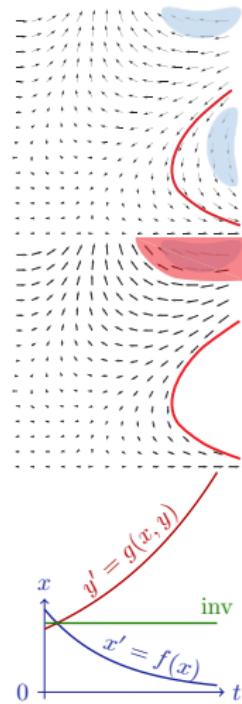
Differential Cut

$$\frac{F \rightarrow [x' = f(x) \& H]C \quad F \rightarrow [x' = f(x) \& H \wedge C]F}{F \rightarrow [x' = f(x) \& H]F}$$

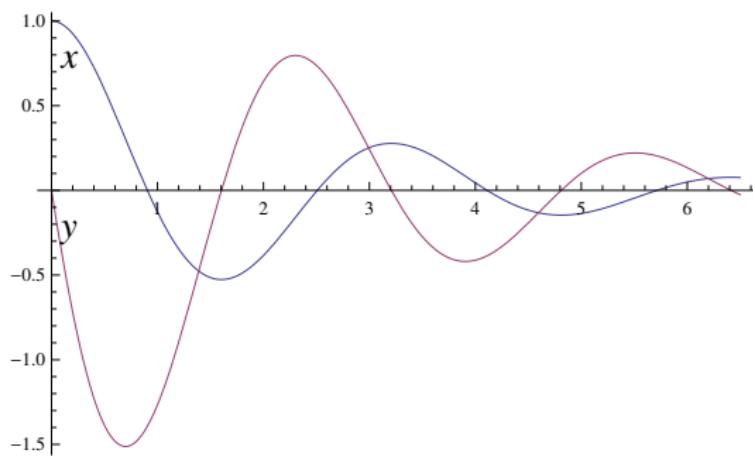
Differential Ghost

$$\frac{F \leftrightarrow \exists y \ G \quad G \rightarrow [x' = f(x), y' = g(x, y) \& H]G}{F \rightarrow [x' = f(x) \& H]F}$$

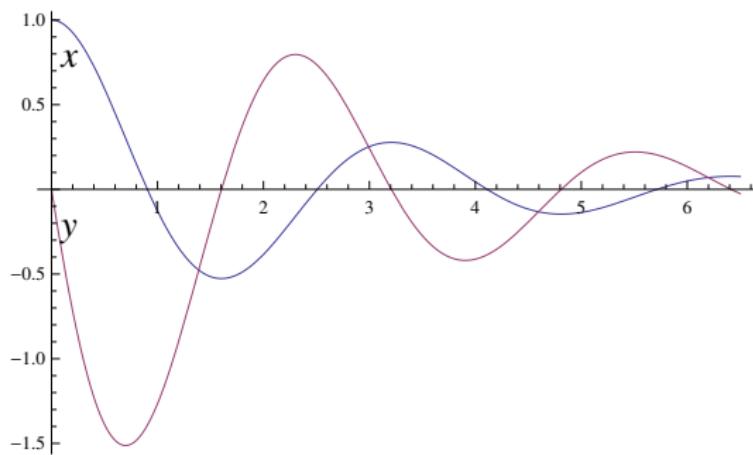
if new $y' = g(x, y)$ has a global solution



$$\omega^2 x^2 + y^2 \leq c^2 \rightarrow [x' = y, y' = -\omega^2 x - 2dwy \text{ & } (\omega \geq 0 \wedge d \geq 0)] \omega^2 x^2 + y^2 \leq c^2$$



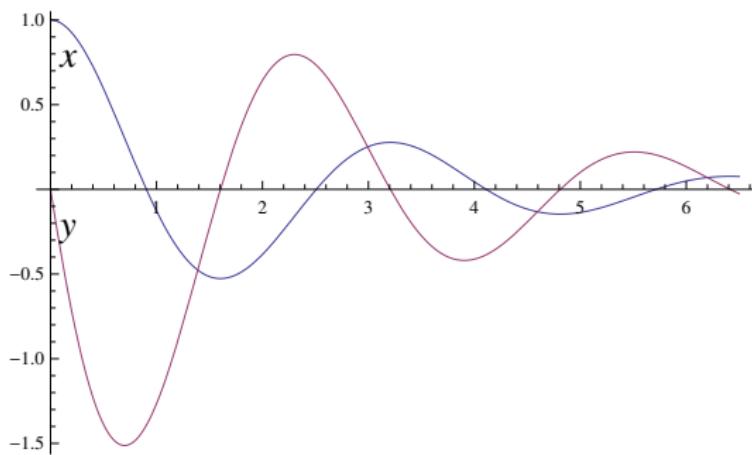
$$\frac{\omega \geq 0 \wedge d \geq 0 \rightarrow [x' := y][y' := -\omega^2 x - 2d\omega y] 2\omega^2 x x' + 2y y' \leq 0}{\omega^2 x^2 + y^2 \leq c^2 \rightarrow [x' = y, y' = -\omega^2 x - 2d\omega y \text{ & } (\omega \geq 0 \wedge d \geq 0)] \omega^2 x^2 + y^2 \leq c^2}$$



$$\omega \geq 0 \wedge d \geq 0 \rightarrow 2\omega^2 xy + 2y(-\omega^2 x - 2dwy) \leq 0$$

$$\omega \geq 0 \wedge d \geq 0 \rightarrow [x' := y][y' := -\omega^2 x - 2dwy] 2\omega^2 x x' + 2y y' \leq 0$$

$$\omega^2 x^2 + y^2 \leq c^2 \rightarrow [x' = y, y' = -\omega^2 x - 2dwy \ \& \ (\omega \geq 0 \wedge d \geq 0)] \omega^2 x^2 + y^2 \leq c^2$$

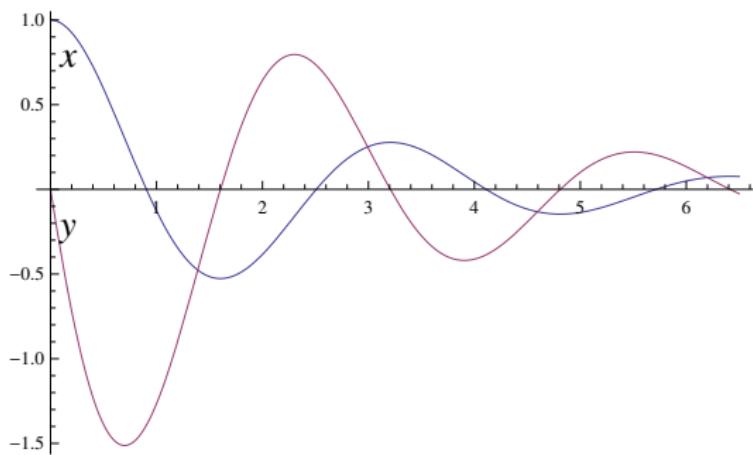


*

$$\omega \geq 0 \wedge d \geq 0 \rightarrow 2\omega^2 xy + 2y(-\omega^2 x - 2dwy) \leq 0$$

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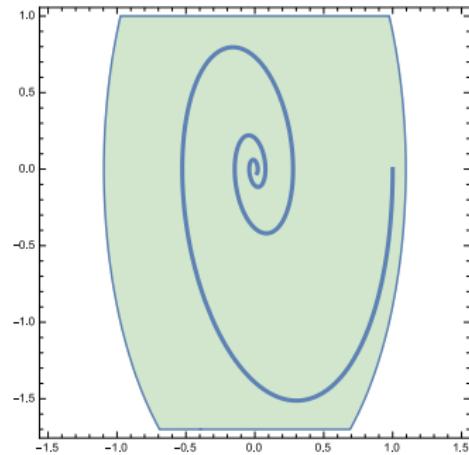
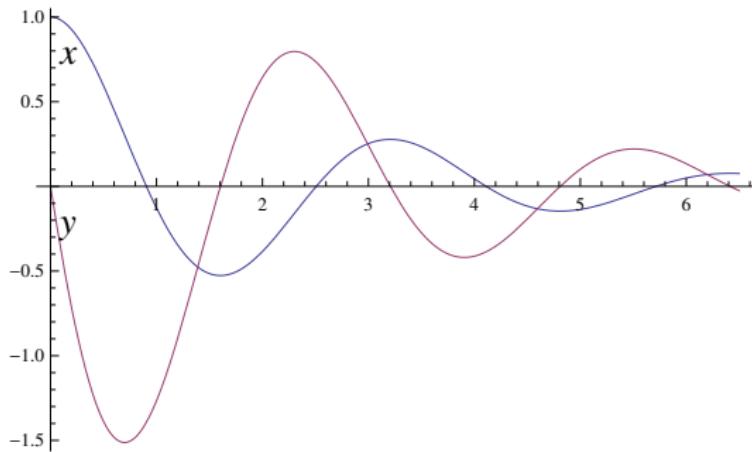


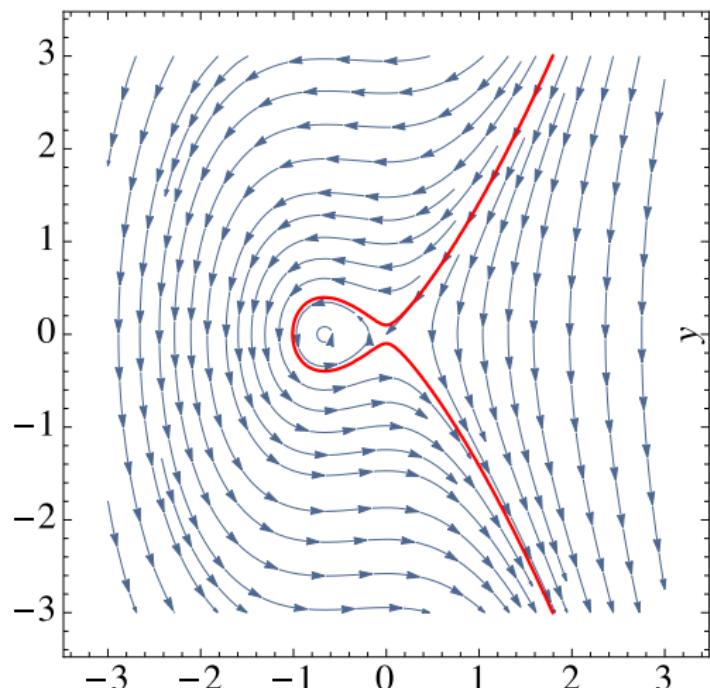
*

$$\omega \geq 0 \wedge d \geq 0 \rightarrow 2\omega^2 xy + 2y(-\omega^2 x - 2dwy) \leq 0$$

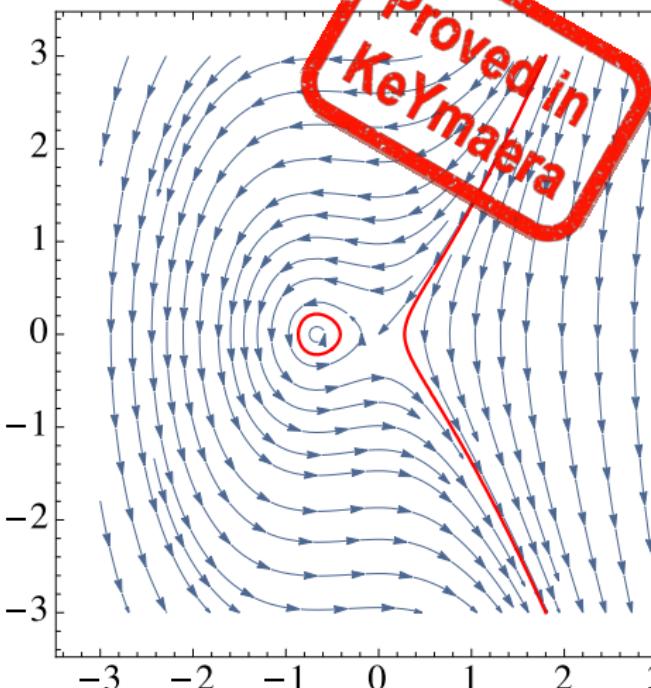
$$\omega \geq 0 \wedge d \geq 0 \rightarrow [x' := y][y' := -\omega^2 x - 2dwy] 2\omega^2 xx' + 2yy' \leq 0$$

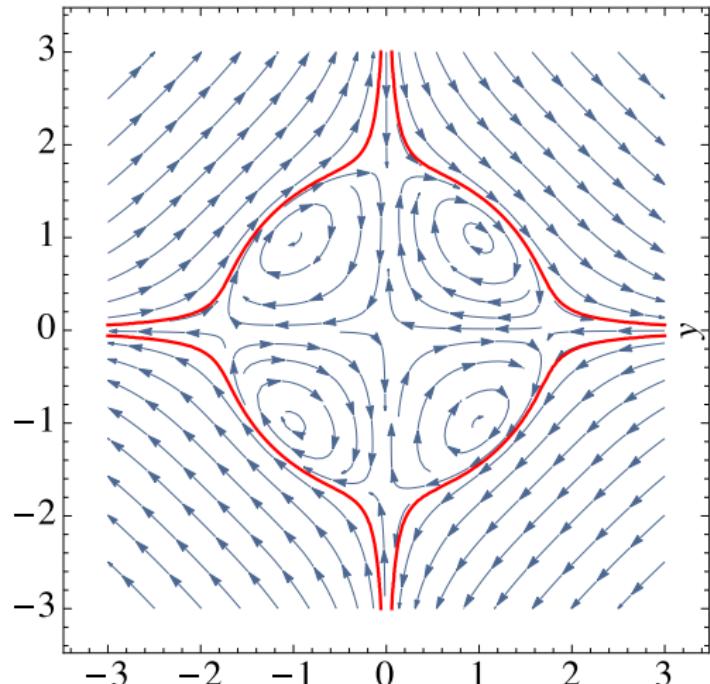
$$\omega^2 x^2 + y^2 \leq c^2 \rightarrow [x' = y, y' = -\omega^2 x - 2dwy \text{ & } (\omega \geq 0 \wedge d \geq 0)] \omega^2 x^2 + y^2 \leq c^2$$



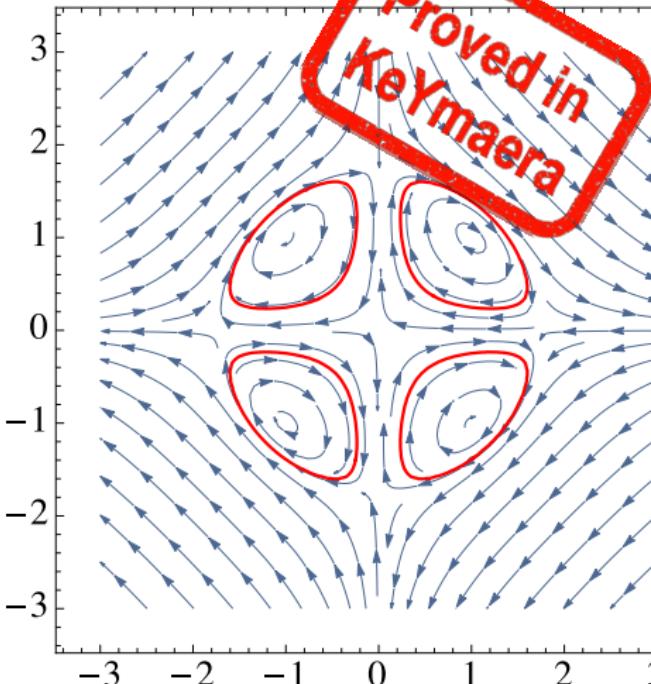


$$x^2 + x^3 - y^2 - c = 0 \rightarrow [x' = -2y, y' = -2x - 3x^2] \quad x^2 + x^3 - y^2 - c = 0$$

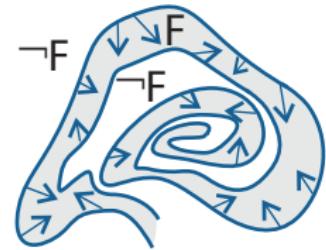
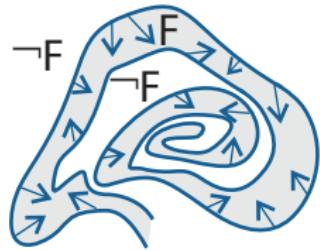




$$[x' = 2x^4y + 4x^2y^3 - 6x^2y, y' = -4x^3y^2 - 2xy^4 + 6xy^2]x^4y^2 + x^2y^4 - 3x^2y^2 \leq c$$



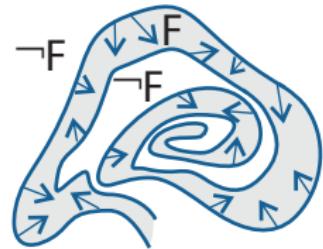
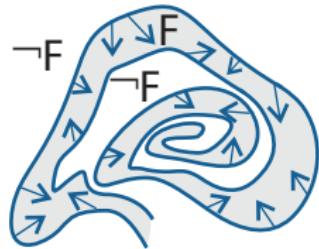
\mathcal{R} Assuming Differential Invariance



$$\frac{H \rightarrow [x' := f(x)]F'}{F \rightarrow [x' = f(x) \& H]F}$$

$$\frac{\textcolor{red}{F} \wedge H \rightarrow [x' := f(x)]F'}{F \rightarrow [x' = \theta \& H]F}$$

Assuming Differential Invariance



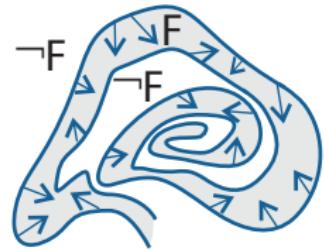
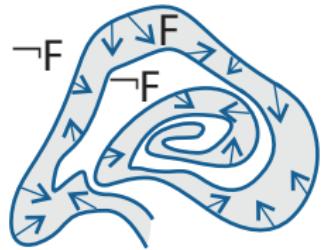
$$\frac{H \rightarrow [x' := f(x)]F'}{F \rightarrow [x' = f(x) \& H]F}$$

$$\frac{\textcolor{red}{F} \wedge H \rightarrow [x' := f(x)]F'}{F \rightarrow [x' = \theta \& H]F}$$

Example (Restrictions)

$$d^2 - 2d + 1 = 0 \rightarrow [d' = e, e' = -d]d^2 - 2d + 1 = 0$$

\mathcal{R} Assuming Differential Invariance



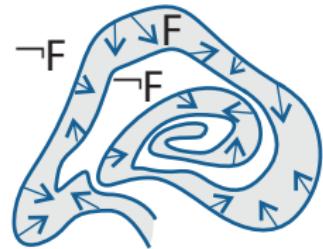
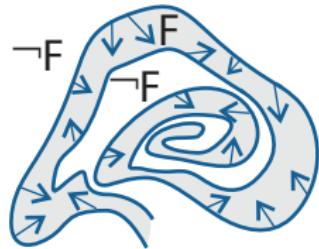
$$\frac{H \rightarrow [x' := f(x)]F'}{F \rightarrow [x' = f(x) \& H]F}$$

$$\frac{\textcolor{red}{F} \wedge H \rightarrow [x' := f(x)]F'}{F \rightarrow [x' = \theta \& H]F}$$

Example (Restrictions)

$$\frac{d^2 - 2d + 1 = 0 \rightarrow [d' := e][e' := -d]2dd' - 2d' = 0}{d^2 - 2d + 1 = 0 \rightarrow [d' = e, e' = -d]d^2 - 2d + 1 = 0}$$

\mathcal{R} Assuming Differential Invariance



$$\frac{H \rightarrow [x' := f(x)]F'}{F \rightarrow [x' = f(x) \& H]F}$$

$$\frac{\textcolor{red}{F} \wedge H \rightarrow [x' := f(x)]F'}{F \rightarrow [x' = \theta \& H]F}$$

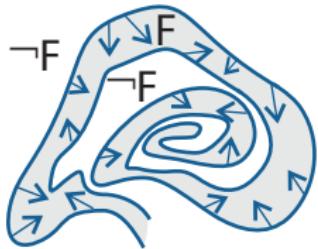
Example (Restrictions)

$$d^2 - 2d + 1 = 0 \rightarrow 2de - 2e = 0$$

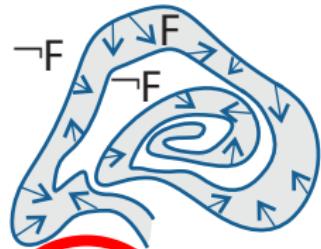
$$d^2 - 2d + 1 = 0 \rightarrow [d' := e][e' := -d]2dd' - 2d' = 0$$

$$d^2 - 2d + 1 = 0 \rightarrow [d' = e, e' = -d]d^2 - 2d + 1 = 0$$

Assuming Differential Invariance



$$\frac{H \rightarrow [x' := f(x)]F'}{F \rightarrow [x' = f(x) \& H]F}$$



$$\frac{\cancel{F \wedge H \rightarrow [x' := f(x)]F'}}{F \rightarrow [x' = f(x) \& H]F}$$

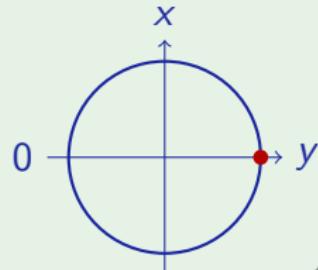
Example (Restrictions are unsound!)

(unsound)

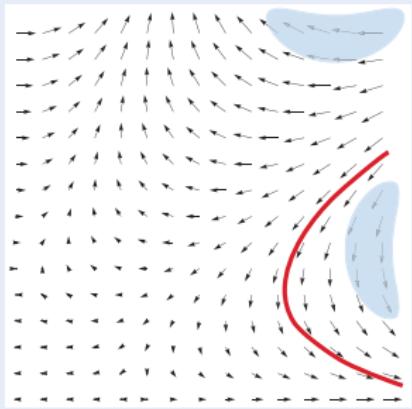
$$\frac{d^2 - 2d + 1 = 0 \rightarrow 2de - 2e = 0}{}$$

$$\frac{d^2 - 2d + 1 = 0 \rightarrow [d' := e][e' := -d]2dd' - 2d' = 0}{}$$

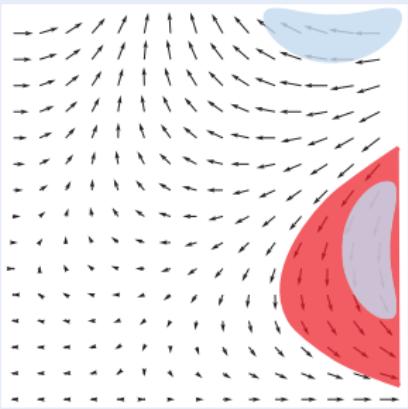
$$\frac{d^2 - 2d + 1 = 0 \rightarrow [d' = e, e' = -d]d^2 - 2d + 1 = 0}{}$$



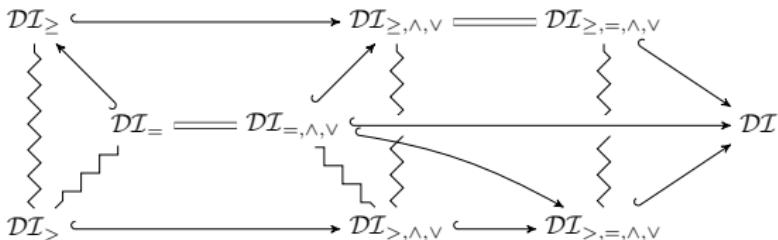
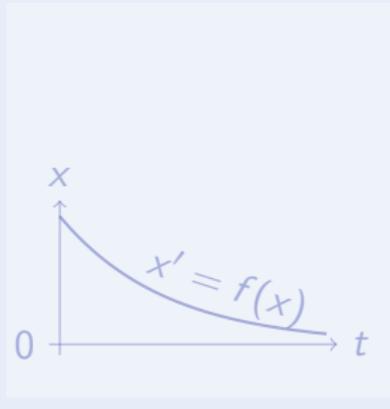
Differential Invariant



Differential Cut

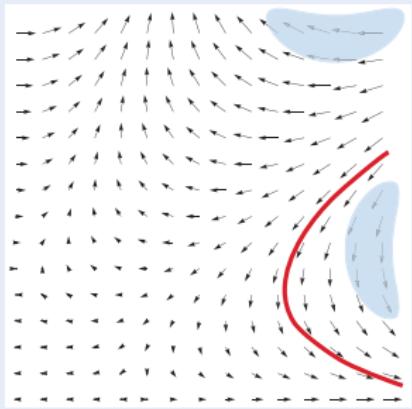


Differential Ghost

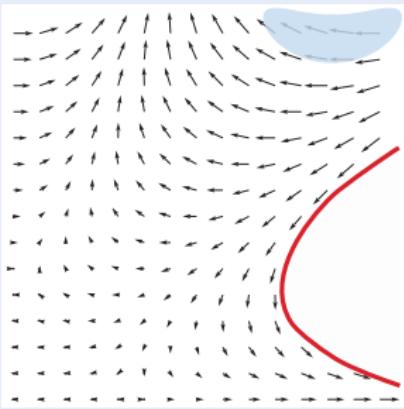
Logic
Probability
theoryMath
Characteristic PDE

JLogComput'10, CAV'08, FMSD'09, LMCS'12, ITP'12

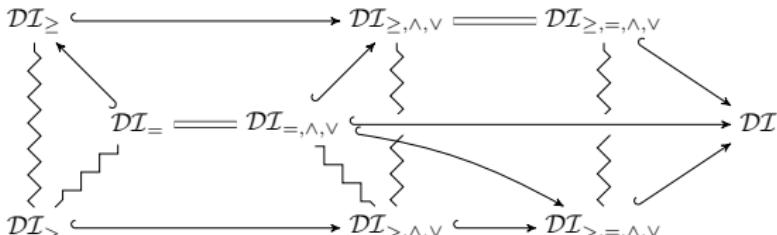
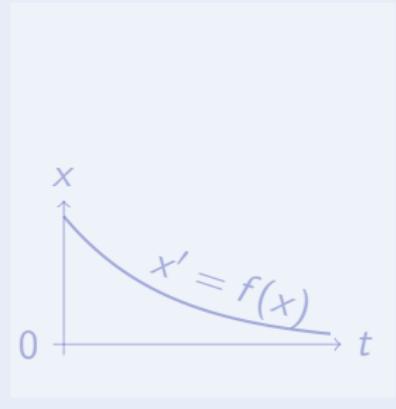
Differential Invariant



Differential Cut



Differential Ghost



Logic
Probability
theory

Math
Characteristic PDE

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$$\text{DC } \overline{x^3 \geq -1 \wedge y^5 \geq 0 \rightarrow [x' = (x - 2)^4 + y^5, y' = y^2] x^3 \geq -1}$$

$$\text{DC} \overline{x^3 \geq -1 \wedge y^5 \geq 0 \rightarrow [x' = (x-2)^4 + y^5, y' = y^2] x^3 \geq -1}$$

$$\text{DI} \overline{y^5 \geq 0 \rightarrow [x' = (x-2)^4 + y^5, y' = y^2] \textcolor{red}{y^5 \geq 0}}$$

$$\text{DC } x^3 \geq -1 \wedge y^5 \geq 0 \rightarrow [x' = (x - 2)^4 + y^5, y' = y^2] x^3 \geq -1$$

$$\frac{[x' := (x - 2)^4 + y^5][y' := y^2] 5y^4 y' \geq 0}{\text{DI } y^5 \geq 0 \rightarrow [x' = (x - 2)^4 + y^5, y' = y^2] y^5 \geq 0}$$

$$\text{DC } x^3 \geq -1 \wedge y^5 \geq 0 \rightarrow [x' = (x - 2)^4 + y^5, y' = y^2] x^3 \geq -1$$

$$\begin{array}{c} \text{QE} \\ \hline 5y^4 y^2 \geq 0 \\ \hline [x' := (x - 2)^4 + y^5] [y' := y^2] 5y^4 y' \geq 0 \\ \hline \text{DI } y^5 \geq 0 \rightarrow [x' = (x - 2)^4 + y^5, y' = y^2] y^5 \geq 0 \end{array}$$

$$\text{DC } x^3 \geq -1 \wedge y^5 \geq 0 \rightarrow [x' = (x - 2)^4 + y^5, y' = y^2] x^3 \geq -1$$

*

$$\begin{array}{c} \text{QE} \\ \hline 5y^4 y^2 \geq 0 \\ \hline [x' := (x - 2)^4 + y^5] [y' := y^2] 5y^4 y' \geq 0 \\ \hline \text{DI } y^5 \geq 0 \rightarrow [x' = (x - 2)^4 + y^5, y' = y^2] y^5 \geq 0 \end{array}$$

$$\text{DI} \quad x^3 \geq -1 \rightarrow [x' = (x - 2)^4 + y^5, y' = y^2 \& \textcolor{red}{y^5 \geq 0}] x^3 \geq -1 \triangleright$$

$$\text{DC} \quad x^3 \geq -1 \wedge y^5 \geq 0 \rightarrow [x' = (x - 2)^4 + y^5, y' = y^2] x^3 \geq -1$$

*

$$\text{QE} \quad 5y^4 \textcolor{red}{y^2} \geq 0$$

$$[x' := (x - 2)^4 + y^5] [y' := y^2] 5y^4 \textcolor{red}{y'} \geq 0$$

$$\text{DI} \quad y^5 \geq 0 \rightarrow [x' = (x - 2)^4 + y^5, y' = y^2] \textcolor{red}{y^5 \geq 0}$$

$$y^5 \geq 0 \rightarrow [x' := (x - 2)^4 + y^5][y' := y^2]2x^2x' \geq 0$$

$$\text{DI} \quad x^3 \geq -1 \rightarrow [x' = (x - 2)^4 + y^5, y' = y^2 \& y^5 \geq 0]x^3 \geq -1 \triangleright$$

$$\text{DC} \quad x^3 \geq -1 \wedge y^5 \geq 0 \rightarrow [x' = (x - 2)^4 + y^5, y' = y^2]x^3 \geq -1$$

*

$$\text{QE} \quad 5y^4y^2 \geq 0$$

$$[x' := (x - 2)^4 + y^5][y' := y^2]5y^4y' \geq 0$$

$$\text{DI} \quad y^5 \geq 0 \rightarrow [x' = (x - 2)^4 + y^5, y' = y^2]y^5 \geq 0$$

QE

$$y^5 \geq 0 \rightarrow 2x^2((x - 2)^4 + y^5) \geq 0$$

$$y^5 \geq 0 \rightarrow [x' := (x - 2)^4 + y^5][y' := y^2]2x^2x' \geq 0$$

DI

$$x^3 \geq -1 \rightarrow [x' = (x - 2)^4 + y^5, y' = y^2 \& y^5 \geq 0]x^3 \geq -1 \triangleright$$

DC

$$x^3 \geq -1 \wedge y^5 \geq 0 \rightarrow [x' = (x - 2)^4 + y^5, y' = y^2]x^3 \geq -1$$

*

QE

$$5y^4y^2 \geq 0$$

$$[x' := (x - 2)^4 + y^5][y' := y^2]5y^4y' \geq 0$$

DI

$$y^5 \geq 0 \rightarrow [x' = (x - 2)^4 + y^5, y' = y^2]y^5 \geq 0$$

*

QE $y^5 \geq 0 \rightarrow 2x^2((x - 2)^4 + y^5) \geq 0$

$y^5 \geq 0 \rightarrow [x' := (x - 2)^4 + y^5][y' := y^2]2x^2x' \geq 0$

DI $x^3 \geq -1 \rightarrow [x' = (x - 2)^4 + y^5, y' = y^2 \& y^5 \geq 0]x^3 \geq -1 \triangleright$

DC $x^3 \geq -1 \wedge y^5 \geq 0 \rightarrow [x' = (x - 2)^4 + y^5, y' = y^2]x^3 \geq -1$

*

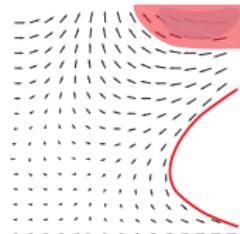
QE $5y^4y^2 \geq 0$

$[x' := (x - 2)^4 + y^5][y' := y^2]5y^4y' \geq 0$

DI $y^5 \geq 0 \rightarrow [x' = (x - 2)^4 + y^5, y' = y^2]y^5 \geq 0$

Differential Cut

$$\frac{F \rightarrow [x' = f(x) \& H]C \ F \rightarrow [x' = f(x) \& H \wedge C]F}{F \rightarrow [x' = f(x) \& H]F}$$



Theorem (Gentzen's Cut Elimination)

$$\frac{A \rightarrow B \vee C \quad A \wedge C \rightarrow B}{A \rightarrow B} \quad \text{cut can be eliminated}$$

Theorem (No Differential Cut Elimination) (LMCS 2012)

Deductive power with differential cut exceeds deductive power without.

$$\mathcal{DCI} > \mathcal{DI}$$

\mathcal{R} Differential Equation Axioms & Differential Axioms

DW $[x' = f(x) \& q(x)]q(x)$

DC $([x' = f(x) \& q(x)]p(x) \leftrightarrow [x' = f(x) \& q(x) \wedge r(x)]p(x))$
 $\leftarrow [x' = f(x) \& q(x)]r(x)$

DE $[x' = f(x) \& q(x)]p(x, x') \leftrightarrow [x' = f(x) \& q(x)][x' := f(x)]p(x, x')$

DI $[x' = f(x) \& q(x)]p(x) \leftarrow (q(x) \rightarrow p(x) \wedge [x' = f(x) \& q(x)](p(x))')$

DG $[x' = f(x) \& q(x)]p(x) \leftrightarrow \exists y [x' = f(x), y' = a(x)y + b(x) \& q(x)]p(x)$

DS $[x' = f \& q(x)]p(x) \leftrightarrow \forall t \geq 0 ((\forall 0 \leq s \leq t q(x + fs)) \rightarrow [x := x + ft]p(x))$

$[':=]$ $[x' := f]p(x') \leftrightarrow p(f)$

$$+' (f(\bar{x}) + g(\bar{x}))' = (f(\bar{x}))' + (g(\bar{x}))'$$

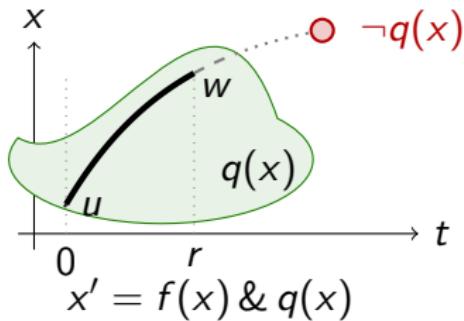
$$\cdot' (f(\bar{x}) \cdot g(\bar{x}))' = (f(\bar{x}))' \cdot g(\bar{x}) + f(\bar{x}) \cdot (g(\bar{x}))'$$

$$\circ' [y := g(x)][y' := 1]((f(g(x)))' = (f(y))' \cdot (g(x))')$$

Axiom (Differential Weakening)

(CADE'15)

$$(\text{DW}) \quad [x' = f(x) \& q(x)]q(x)$$



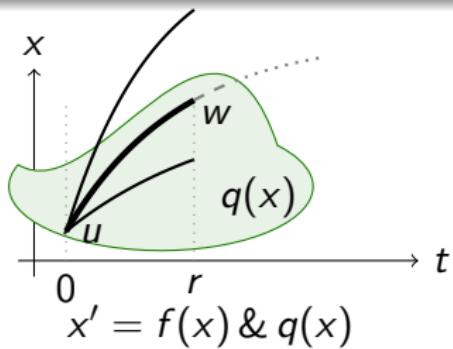
Differential equations cannot leave their evolution domains. Implies:

$$[x' = f(x) \& q(x)]p(x) \leftrightarrow [x' = f(x) \& q(x)](q(x) \rightarrow p(x))$$

Axiom (Differential Cut)

(CADE'15)

$$\text{(DC)} \quad ([x' = f(x) \& q(x)]p(x) \leftrightarrow [x' = f(x) \& q(x) \wedge r(x)]p(x)) \\ \leftarrow [x' = f(x) \& q(x)]r(x)$$



DC is a cut for differential equations.

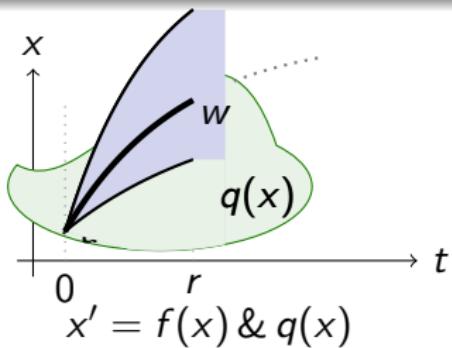
DC is a differential modal modus ponens K.

Can't leave $r(x)$, then might as well restrict state space to $r(x)$.

Axiom (Differential Cut)

(CADE'15)

$$\text{(DC)} \quad ([x' = f(x) \& q(x)]p(x) \leftrightarrow [x' = f(x) \& q(x) \wedge r(x)]p(x)) \\ \leftarrow [x' = f(x) \& q(x)]r(x)$$



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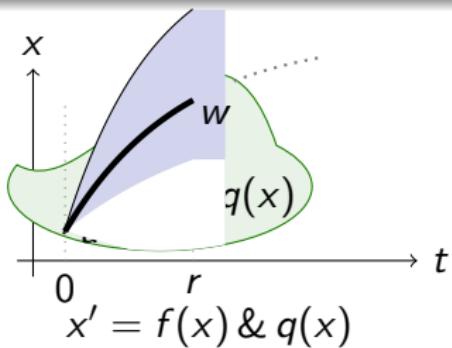
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Axiom (Differential Cut)

(CADE'15)

$$\begin{aligned} (\text{DC}) \quad & ([x' = f(x) \& q(x)]p(x) \leftrightarrow [x' = f(x) \& q(x) \wedge r(x)]p(x)) \\ & \leftarrow [x' = f(x) \& q(x)]r(x) \end{aligned}$$



DC is a cut for differential equations.

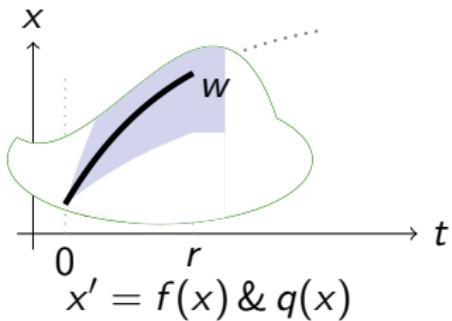
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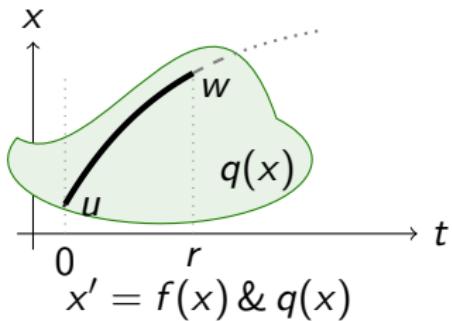
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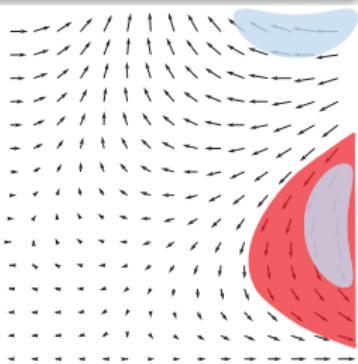
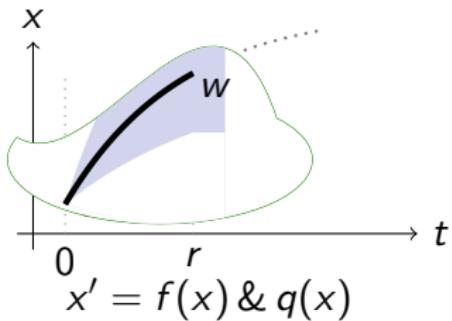
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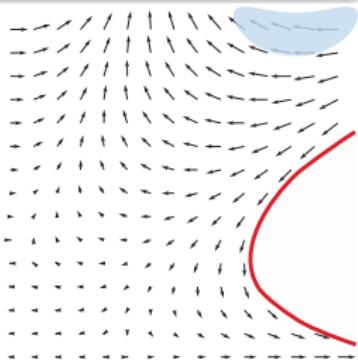
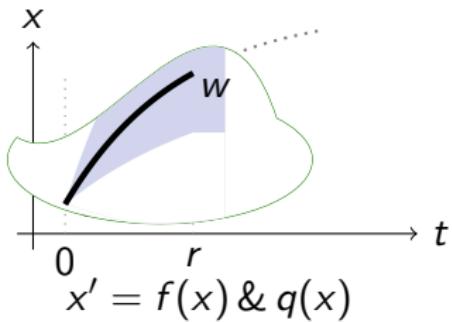
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Axiom (Differential Cut)

(CADE'15)

$$(DC) \quad ([x' = f(x) \& q(x)]p(x) \leftrightarrow [x' = f(x) \& q(x) \wedge r(x)]p(x)) \\ \leftarrow [x' = f(x) \& q(x)]r(x)$$



DC is a cut for differential equations.

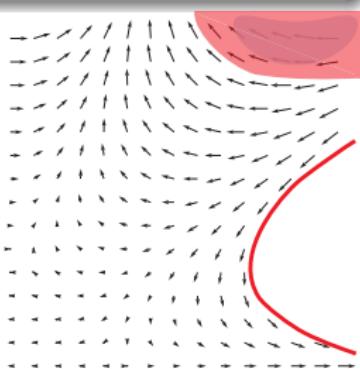
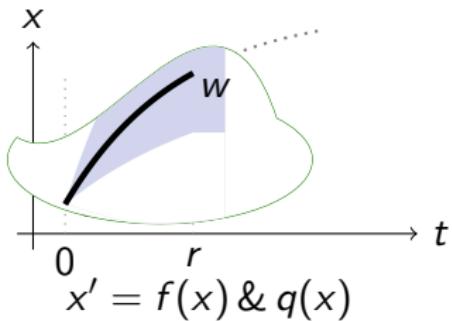
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Axiom (Differential Cut)

(CADE'15)

$$\begin{aligned}
 (\text{DC}) \quad & ([x' = f(x) \& q(x)]p(x) \leftrightarrow [x' = f(x) \& q(x) \wedge r(x)]p(x)) \\
 & \leftarrow [x' = f(x) \& q(x)]r(x)
 \end{aligned}$$



DC is a cut for differential equations.

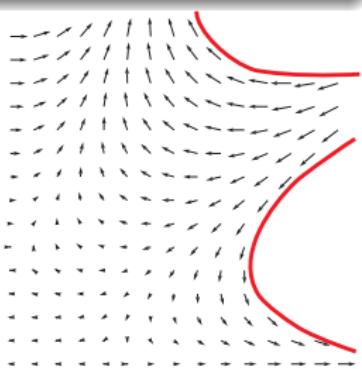
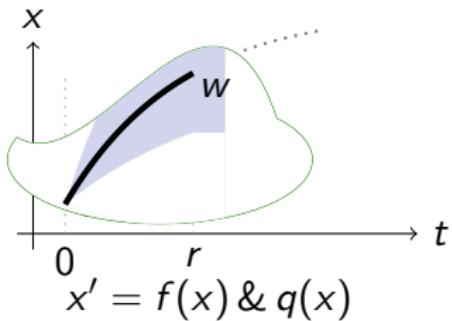
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Axiom (Differential Cut)

(CADE'15)

$$(DC) \quad ([x' = f(x) \& q(x)]p(x) \leftrightarrow [x' = f(x) \& q(x) \wedge r(x)]p(x)) \\ \leftarrow [x' = f(x) \& q(x)]r(x)$$



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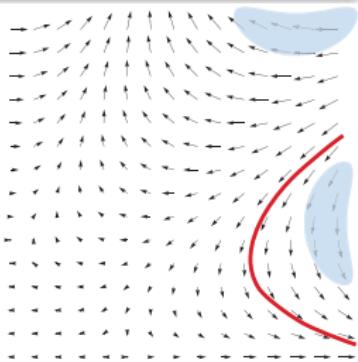
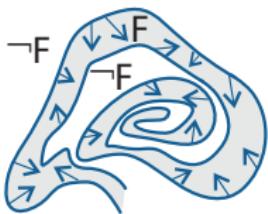
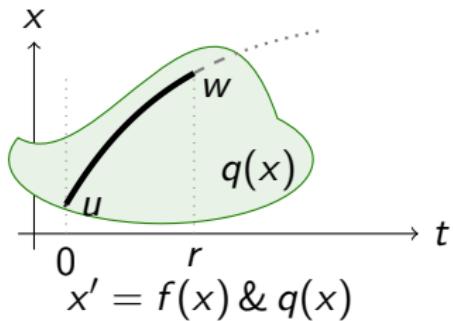
DC is a differential modal modus ponens K.

Can't leave $r(x)$, then might as well restrict state space to $r(x)$.

Axiom (Differential Invariant)

(CADE'15)

$$(DI) \ [x' = f(x) \& q(x)] p(x) \leftarrow (q(x) \rightarrow p(x)) \wedge [x' = f(x) \& q(x)] (p(x))'$$



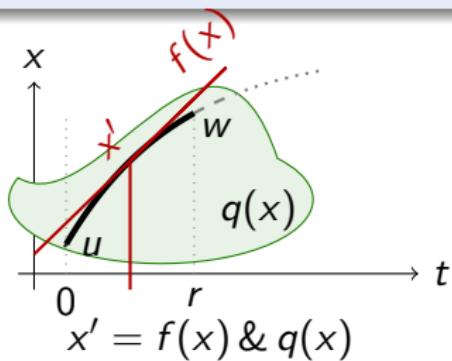
Differential invariant: $p(x)$ true now and its differential $(p(x))'$ true always
 What's the differential of a formula???

What's the meaning of a differential term ... in a state???

Axiom (Differential Effect)

(CADE'15)

$$(\text{DE}) \quad [x' = f(x) \& q(x)] p(x, x') \leftrightarrow [x' = f(x) \& q(x)][x' := f(x)] p(x, x')$$



Effect of differential equation on differential symbol x'

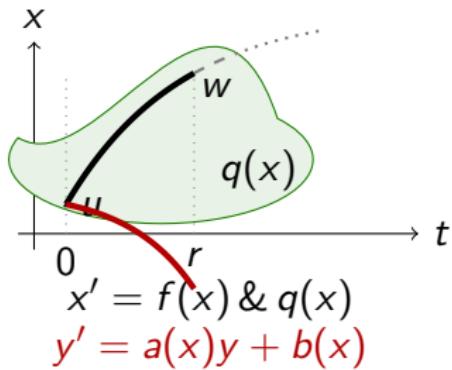
$[x' := f(x)]$ instantly mimics continuous effect $[x' = f(x)]$ on x'

$[x' := f(x)]$ selects vector field $x' = f(x)$ for subsequent differentials

Axiom (Differential Ghost)

(CADE'15)

$$(\text{DG}) \ [x' = f(x) \ \& \ q(x)]p(x) \leftrightarrow \exists y \ [x' = f(x), \textcolor{red}{y' = a(x)y + b(x)} \ \& \ q(x)]p(x)$$



Differential ghost/auxiliaries: extra differential equations that exist

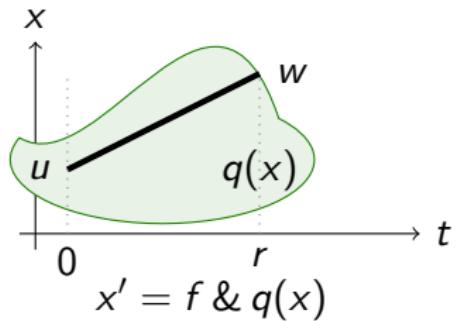
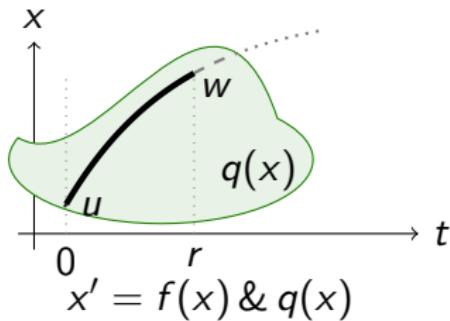
Can cause new invariants

“Dark matter” counterweight to balance conserved quantities

Axiom (Differential Solution)

(CADE'15)

$$(\text{DS}) \ [x' = f \ \& \ q(x)]p(x) \leftrightarrow \forall t \geq 0 ((\forall 0 \leq s \leq t q(x+fs)) \rightarrow [\cancel{x := x + ft}]p(x))$$



Differential solutions: solve differential equations
with DG,DC and inverse companions

- ① DI proves a property of an ODE inductively by its differentials
- ② DE exports vector field, possibly after DW exports evolution domain
- ③ CE+CQ reason efficiently in Equivalence or eQuational context
- ④ G isolates postcondition
- ⑤ [=] differential substitution uses vector field
- ⑥ ! differential computations are axiomatic (US)

$$\begin{array}{c}
 \text{QE} \frac{*}{x^3 \cdot x + x \cdot x^3 \geq 0} \quad \text{US} \frac{*}{(x \cdot x)' = (x)' \cdot x + x \cdot (x)'} \\
 [=] \frac{x' := x^3 \quad x' \cdot x + x \cdot x' \geq 0}{[x' := x^3] x' \cdot x + x \cdot x' \geq 0} \quad \text{CQ} \frac{(x \cdot x)' \geq 0 \leftrightarrow x' \cdot x + x \cdot x' \geq 0}{(x \cdot x \geq 1)' \leftrightarrow x' \cdot x + x \cdot x' \geq 0} \\
 \text{G} \frac{x' = x^3 \quad [x' := x^3] x' \cdot x + x \cdot x' \geq 0}{[x' = x^3] [x' := x^3] x' \cdot x + x \cdot x' \geq 0} \\
 \text{CE} \quad [x' = x^3] [x' := x^3] (x \cdot x \geq 1)' \\
 \text{DE} \quad [x' = x^3] (x \cdot x \geq 1)' \\
 \text{DI} \quad x \cdot x \geq 1 \rightarrow [x' = x^3] x \cdot x \geq 1
 \end{array}$$



$$\llbracket (\theta)' \rrbracket u = ???$$

$$\llbracket (x^2)' \rrbracket u$$

$$\llbracket (\theta)' \rrbracket u = ???$$

$$\llbracket (x^2)' \rrbracket u = \llbracket 2x \rrbracket u ?$$

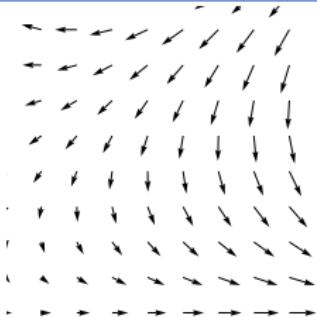
\mathcal{R} The Meaning of Primes



$$\llbracket (\theta)' \rrbracket u = ???$$

$$\llbracket (x^2)' \rrbracket u = \llbracket 2x \rrbracket u ?$$

depends on the differential equation ...



\mathcal{R} The Meaning of Primes

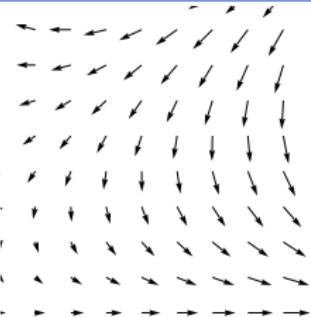


$$\llbracket (\theta)' \rrbracket u = ???$$

$$\llbracket (x^2)' \rrbracket u = \llbracket 2x \rrbracket u ?$$

depends on the differential equation ...

well-defined locally in an isolated state at all?



$$[(\theta)'] u = ???$$

$$[(x^2)'] u = [2x] u ?$$

depends on the differential equation ...

well-defined locally in an isolated state at all?

$$[(\theta)'] u = \sum_x u(x') \frac{\partial [\theta]'}{\partial x}(u) = \sum_x u(x') \frac{\partial [\theta] u_x^X}{\partial X}$$

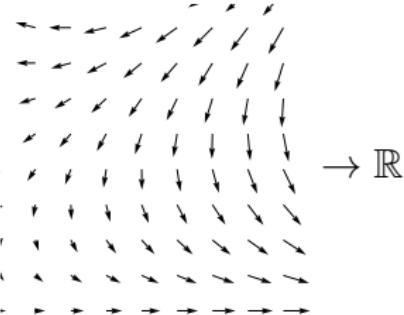
$$[(\theta)'] = d[\theta] = \sum_{i=1}^n \frac{\partial [\theta]}{\partial x^i} dx^i$$

depends on
 $u(x'_i) = dx^i$

depends on
state u

tangent
space basis

cotangent
space basis



$$[(\theta)'] u = ???$$

$$[(x^2)'] u = [2x] u ?$$

depends on the differential equation ...

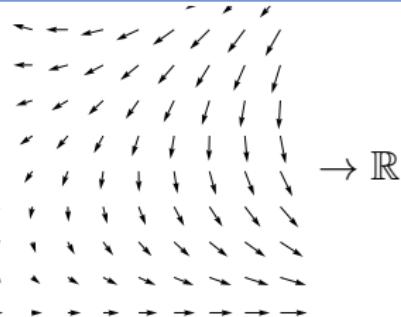
well-defined locally in an isolated state at all?

$$[(\theta)'] u = \sum_x u(x') \frac{\partial [\theta]'}{\partial x}(u) = \sum_x u(x') \frac{\partial [\theta] u_x^X}{\partial X}$$

$$[(\theta)'] = d[\theta] = \sum_{i=1}^n \frac{\partial [\theta]}{\partial x^i} dx^i$$

$u(x')$ is the local shadow of $\frac{dx}{dt}$ if that existed

$(\theta)'$ represents how θ changes locally, depending on x'



Lemma (Differential lemma)

If $\varphi \models x' = f(x) \wedge Q$ for duration $r > 0$, then for all $0 \leq \zeta \leq r$:

$$\text{Syntactic} \rightarrow \llbracket (\eta)' \rrbracket \varphi(\zeta) = \frac{d \llbracket \eta \rrbracket \varphi(t)}{dt}(\zeta) \leftarrow \text{Analytic}$$

Lemma (Differential assignment)

If $\varphi \models x' = f(x) \wedge Q$ then $\varphi \models \phi \leftrightarrow [x' := f(x)]\phi$

Lemma (Derivations)

$$(\theta + \eta)' = (\theta)' + (\eta)'$$

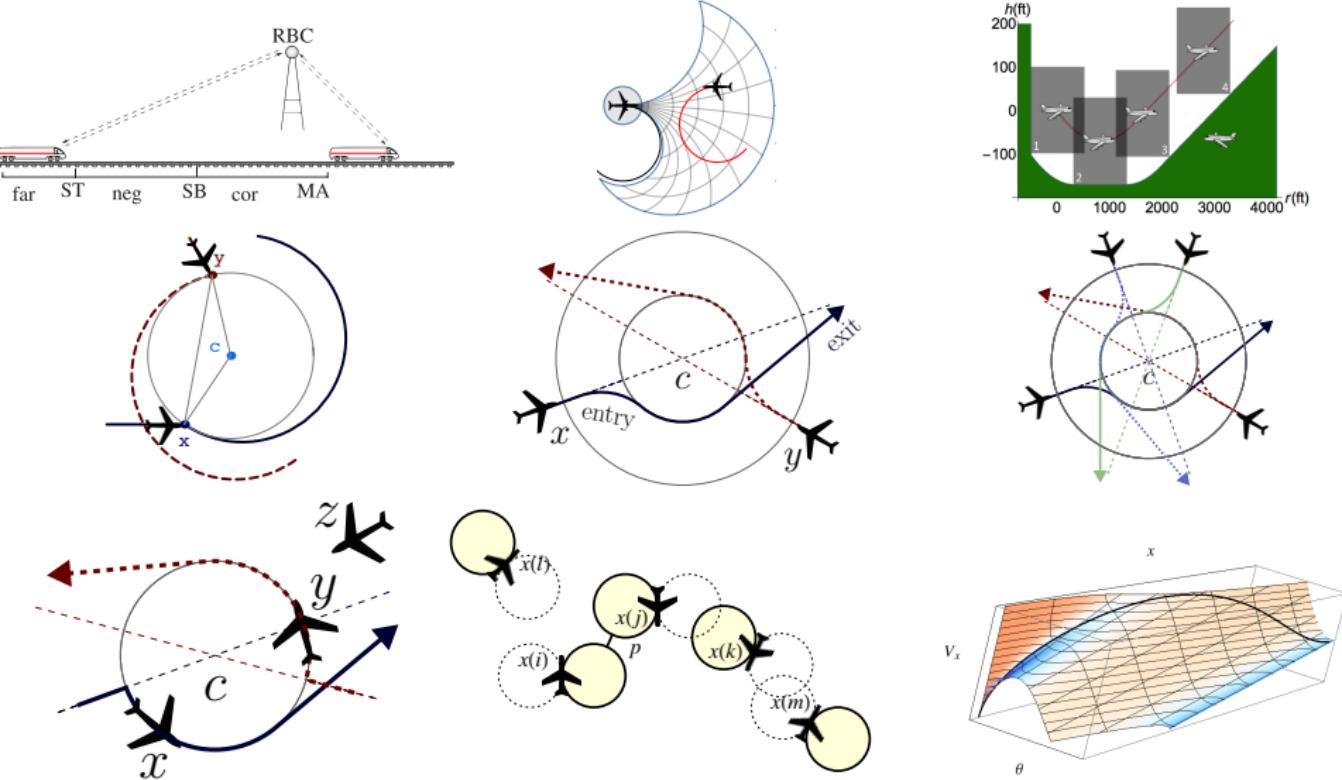
$$(\theta \cdot \eta)' = (\theta)' \cdot \eta + \theta \cdot (\eta)'$$

$$[y := \theta][y' := 1]((f(\theta))' = (f(y))' \cdot (\theta)') \quad \text{for } y, y' \notin \theta$$

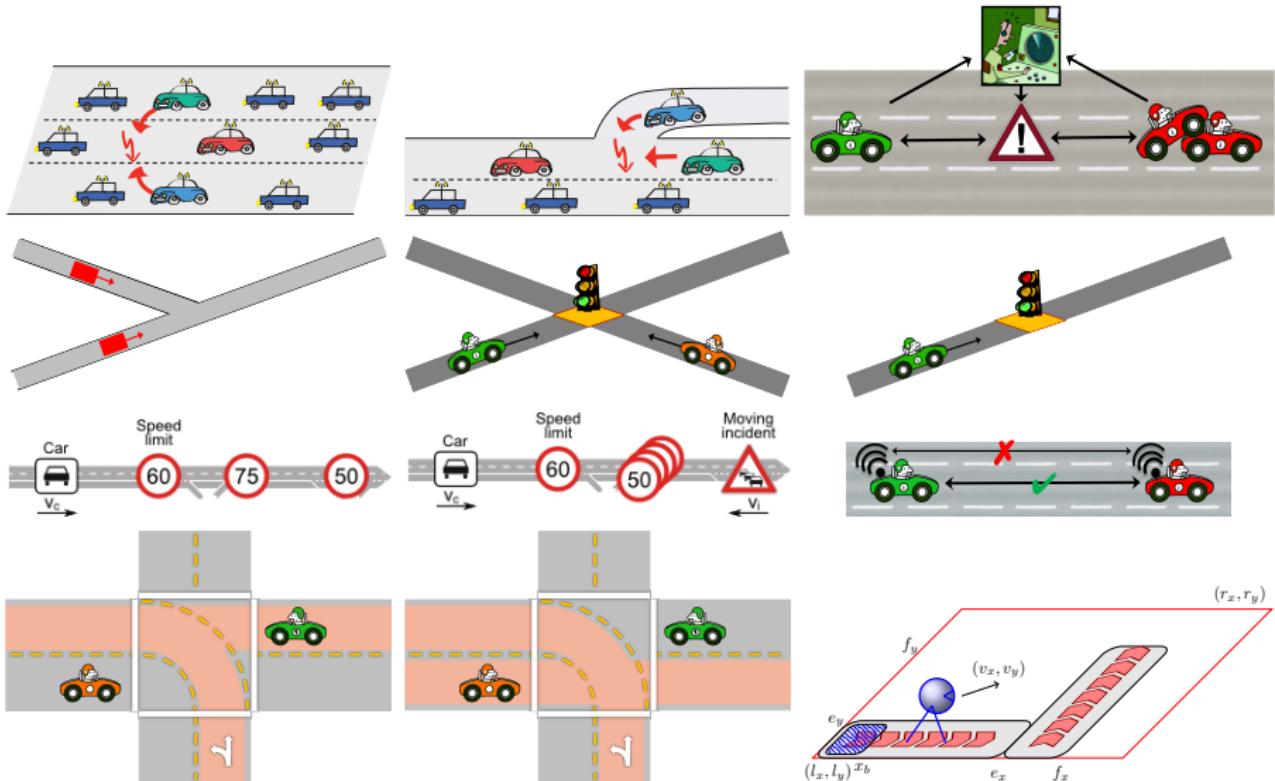
$$(f)' = 0 \quad \text{for arity 0 functions/numbers } f$$

- 1 CPS are Multi-Dynamical Systems
 - Hybrid Systems
 - Hybrid Games
- 2 Dynamic Logic of Dynamical Systems
 - Syntax
 - Semantics
 - Example: Car Control Design
- 3 Proofs for CPS
 - Compositional Proof Calculus
 - Example: Safe Car Control
- 4 Theory of CPS
 - Soundness and Completeness
 - Differential Invariants
 - Example: Elementary Differential Invariants
 - Differential Axioms
- 5 Applications
- 6 Summary

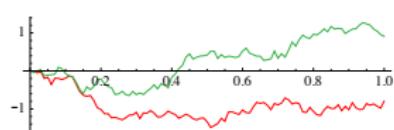
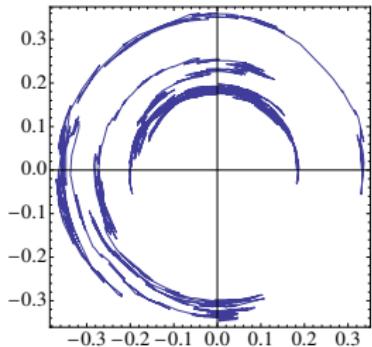
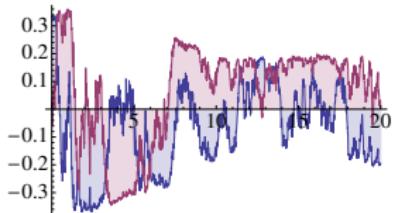
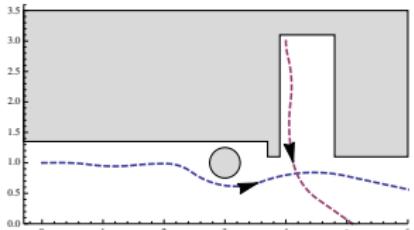
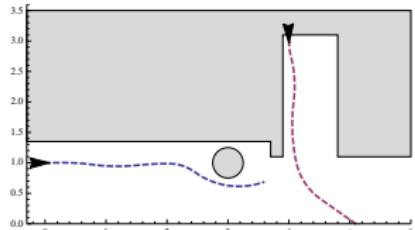
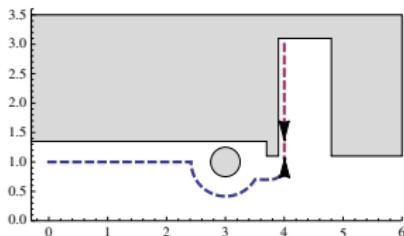
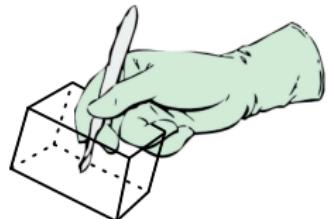
Verified CPS Applications



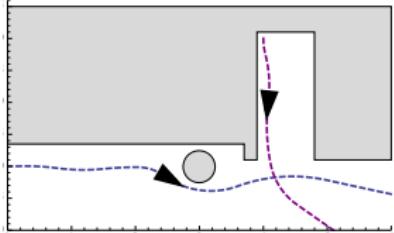
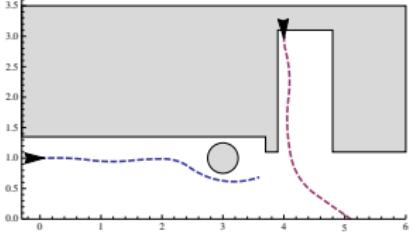
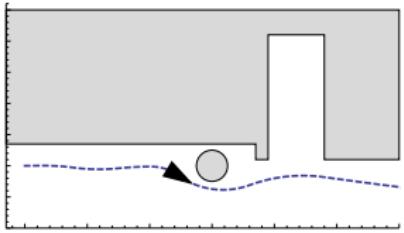
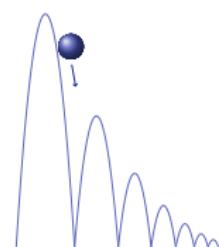
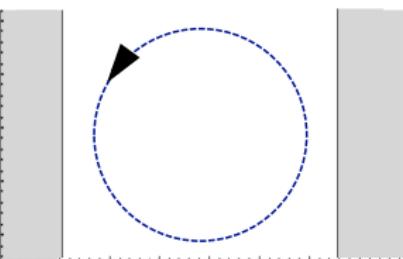
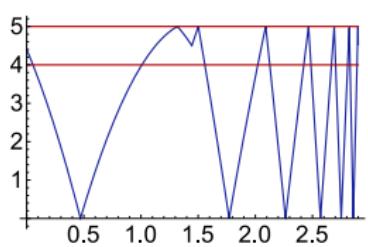
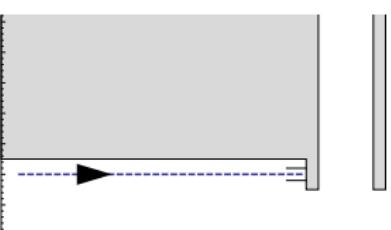
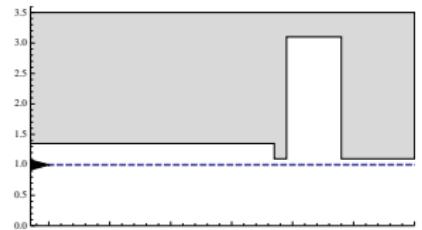
ICFEM'09, JAIS'14, TACAS'15, CAV'08, FM'09, HSCC'11, HSCC'13, TACAS'14



FM'11, LMCS'12, ICCPS'12, ITSC'11, ITSC'13, IJCAR'12



HSCC'13, RSS'13, CADE'12



15-424/624 Foundations of Cyber-Physical Systems students

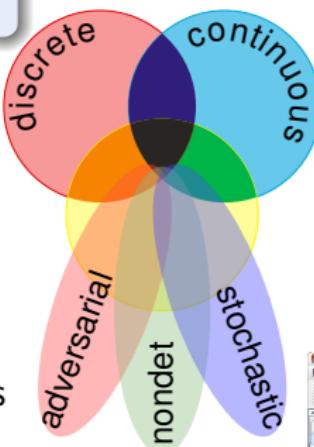
- 1 CPS are Multi-Dynamical Systems
 - Hybrid Systems
 - Hybrid Games
- 2 Dynamic Logic of Dynamical Systems
 - Syntax
 - Semantics
 - Example: Car Control Design
- 3 Proofs for CPS
 - Compositional Proof Calculus
 - Example: Safe Car Control
- 4 Theory of CPS
 - Soundness and Completeness
 - Differential Invariants
 - Example: Elementary Differential Invariants
 - Differential Axioms
- 5 Applications
- 6 Summary

≈LOC	
KeYmaera X	1 682
KeYmaera	65 989
KeY	51 328
HOL Light	396
Isabelle/Pure	8 113
Nuprl	15 000 + 50 000
Coq	20 000
HSolver	20 000
Flow*	25 000
PHAVer	30 000
dReal	50 000 + millions
SpaceEx	100 000
HyCreate2	6 081 + user model analysis

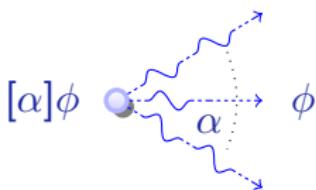
Disclaimer: These self-reported estimates of the soundness-critical lines of code + rules are to be taken with a grain of salt. Different languages, capabilities, styles

differential dynamic logic

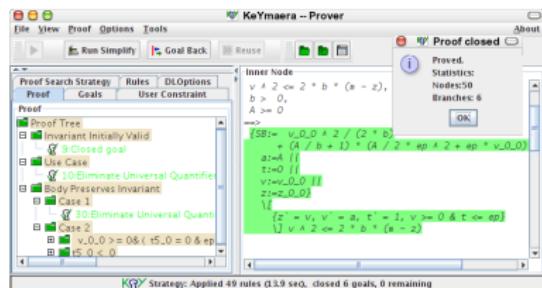
$$d\mathcal{L} = DL + HP$$



- Multi-dynamical systems
- Combine simple dynamics
- Tame complexity
- Logic & proofs for CPS
- Theory of CPS
- Applications

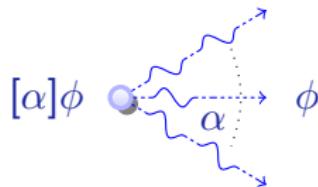
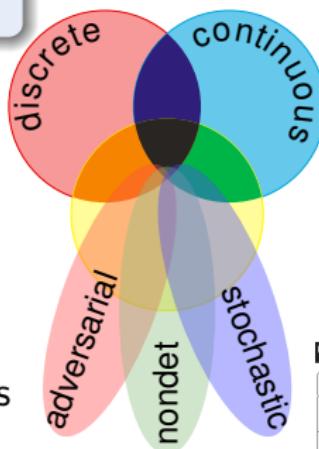


KeYmaera Prover



differential dynamic logic

$$d\mathcal{L} = DL + HP$$



- Multi-dynamical systems
- Combine simple dynamics
- Tame complexity
- Logic & proofs for CPS
- Theory of CPS
- Applications

The screenshot shows the KeYmaera X interface with several tabs: Agenda, Overview, Induction Step, Rule Application, and Custom Tactics. The Overview tab displays an invariant: $v \geq 0 \wedge A > 0 \wedge B > 0 \vdash v \geq 0 \wedge B > 0 \wedge A > 0$. The Induction Step tab shows an induction step for $v \geq 0 \wedge A > 0 \wedge B > 0 \vdash v \geq 0$. The Rule Application tab shows a tactic state with formulas involving $x \geq 0$, $y \geq 0$, $x^2 = y^2$, and $x = y$. The Custom Tactics tab shows a tactic named 'ImpliesRight & Seq & Choice & AndRight & <1' with its steps: Assign & Seq & Test & ImpliesRight & ODESolve & ImpliesRight & Arithmetic, Choice & AndRight & <1, ImpliesRight & Seq & Test & ImpliesRight & ODESolve & ImpliesRight & Arithmetic, Assign & Seq & Test & ImpliesRight & ODESolve & ImpliesRight & Arithmetic.

Students and postdocs of the Logical Systems Lab at Carnegie Mellon
Nathan Fulton, David Henriques, Sarah Loos, João Martins, Erik Zawadzki
Khalil Ghorbal, Jean-Baptiste Jeannin, Stefan Mitsch



BOSCH

Invented for life



TOYOTA

TOYOTA TECHNICAL CENTER

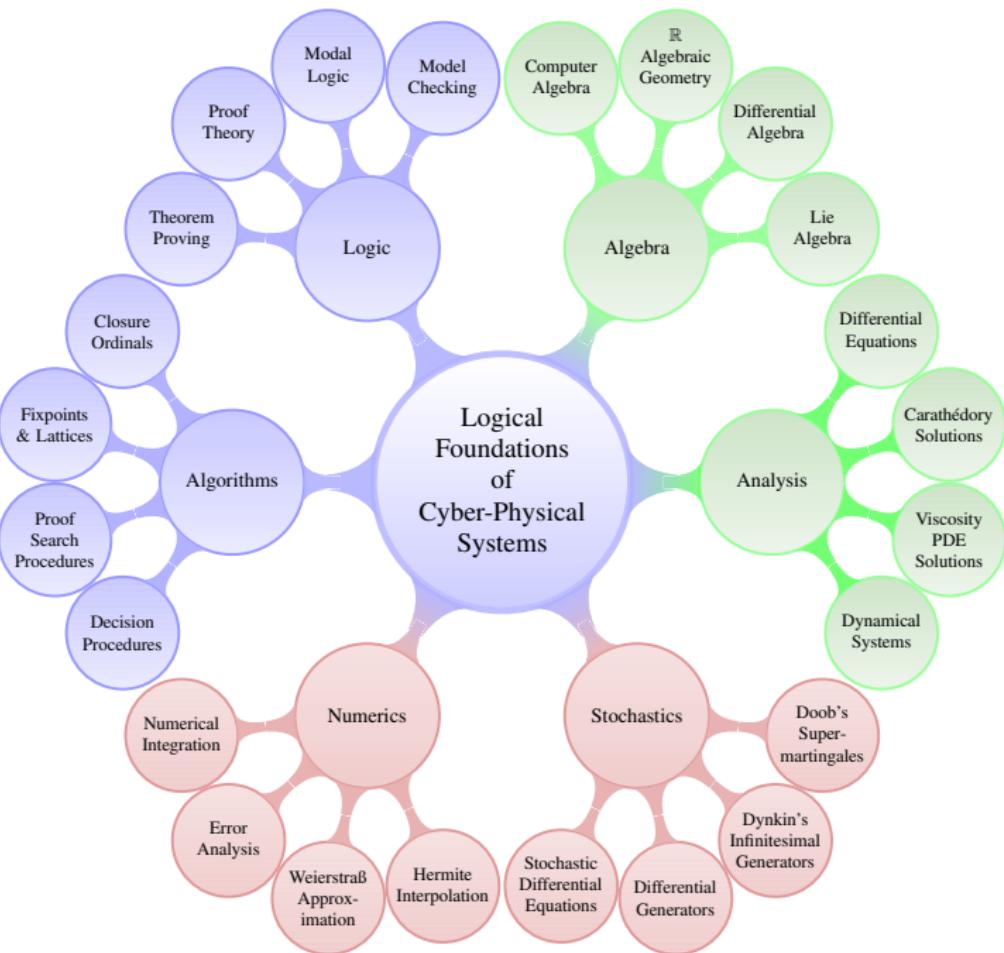


JOHNS HOPKINS
APPLIED PHYSICS LABORATORY

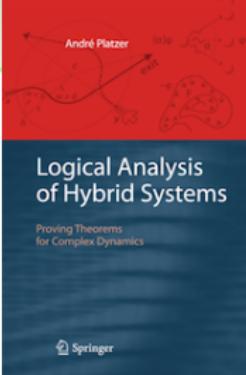
How to trust a computer to control physics

Recipe

- ① CPS promise a transformative impact
- ② CPS have to be safe to make the world a better place
- ③ Safety needs a safety analysis
- ④ Analytic tools for CPS have to be sound
- ⑤ Sound analysis needs sound and strong foundations
- ⑥ Foundations themselves have to be challenged, e.g., by applications
- ⑦ Logic has a lot to offer for CPS
- ⑧ CPS bring excitement and new challenges to logic



Logical Foundations of Cyber-Physical Systems



([:=]) $[x := f]p(x) \leftrightarrow p(f)$

([?]) $[?q]p \leftrightarrow (q \rightarrow p)$

([\cup]) $[a \cup b]p(\bar{x}) \leftrightarrow [a]p(\bar{x}) \wedge [b]p(\bar{x})$

([;]) $[a; b]p(\bar{x}) \leftrightarrow [a][b]p(\bar{x})$

([*]) $[a^*]p(\bar{x}) \leftrightarrow p(\bar{x}) \wedge [a][a^*]p(\bar{x})$

(K) $[a](p(\bar{x}) \rightarrow q(\bar{x})) \rightarrow ([a]p(\bar{x}) \rightarrow [a]q(\bar{x}))$

(I) $[a^*](p(\bar{x}) \rightarrow [a]p(\bar{x})) \rightarrow (p(\bar{x}) \rightarrow [a^*]p(\bar{x}))$

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

(DS) $[x' = f]p(x) \leftrightarrow \forall t \geq 0 [x := x + ft]p(x)$

$$(G) \quad \frac{p(\bar{x})}{[a]p(\bar{x})}$$

$$(\forall) \quad \frac{p(x)}{\forall x p(x)}$$

$$(MP) \quad \frac{p \rightarrow q \quad p}{q}$$

$$(CT) \quad \frac{f(\bar{x}) = g(\bar{x})}{c(f(\bar{x})) = c(g(\bar{x}))}$$

$$(CQ) \quad \frac{f(\bar{x}) = g(\bar{x})}{p(f(\bar{x})) \leftrightarrow p(g(\bar{x}))}$$

$$(CE) \quad \frac{p(\bar{x}) \leftrightarrow q(\bar{x})}{C(p(\bar{x})) \leftrightarrow C(q(\bar{x}))}$$

(DW) $[x' = f(x) \& q(x)]q(x)$

(DC) $([x' = f(x) \& q(x)]p(x) \leftrightarrow [x' = f(x) \& q(x) \wedge r(x)]p(x))$
 $\quad \leftarrow [x' = f(x) \& q(x)]r(x)$

(DE) $[x' = f(x) \& q(x)]p(x, x') \leftrightarrow [x' = f(x) \& q(x)][x' := f(x)]p(x, x')$

(DI) $[x' = f(x) \& q(x)]p(x) \leftarrow (q(x) \rightarrow p(x) \wedge [x' = f(x) \& q(x)](p(x))')$

(DG) $[x' = f(x) \& q(x)]p(x) \leftrightarrow \exists y [x' = f(x), y' = a(x)y + b(x) \& q(x)]p(x)$

(DS) $[x' = f \& q(x)]p(x) \leftrightarrow \forall t \geq 0 ((\forall 0 \leq s \leq t q(x + fs)) \rightarrow [x := x + ft]p(x))$

([':=]) $[x' := f]p(x') \leftrightarrow p(f)$

(+') $(f(\bar{x}) + g(\bar{x}))' = (f(\bar{x}))' + (g(\bar{x}))'$

(·') $(f(\bar{x}) \cdot g(\bar{x}))' = (f(\bar{x}))' \cdot g(\bar{x}) + f(\bar{x}) \cdot (g(\bar{x}))'$

(o') $[y := g(x)][y' := 1]((f(g(x)))' = (f(y))' \cdot (g(x))')$



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7 Differential Radical Invariants

- Differential Radical Invariants

8 ACAS X

Theorem (Differential radical invariant characterization)

$$\frac{h = 0 \rightarrow \bigwedge_{i=0}^{N-1} (h^{(i)})_{x'}^p = 0}{h = 0 \rightarrow [x' = p]h = 0}$$

characterizes all algebraic invariants, where $N = \text{ord } \sqrt[p]{(h)}$, i.e.

$$(h^{(N)})_{x'}^p = \sum_{i=0}^{N-1} g_i (h^{(i)})_{x'}^p \quad (g_i \in \mathbb{R}[x])$$

Corollary (Algebraic Invariants Decidable)

Algebraic invariants of algebraic differential equations are decidable.

with Khalil Ghorbal TACAS'14

Study (6th Order Longitudinal Flight Equations)

$$u' = \frac{X}{m} - g \sin(\theta) - qw \quad \text{axial velocity}$$

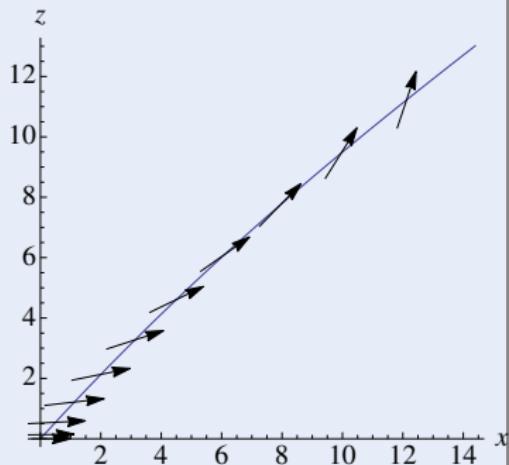
$$w' = \frac{Z}{m} + g \cos(\theta) + qu \quad \text{vertical velocity}$$

$$x' = \cos(\theta)u + \sin(\theta)w \quad \text{range}$$

$$z' = -\sin(\theta)u + \cos(\theta)w \quad \text{altitude}$$

$$\theta' = q \quad \text{pitch angle}$$

$$q' = \frac{M}{I_{yy}} \quad \text{pitch rate}$$

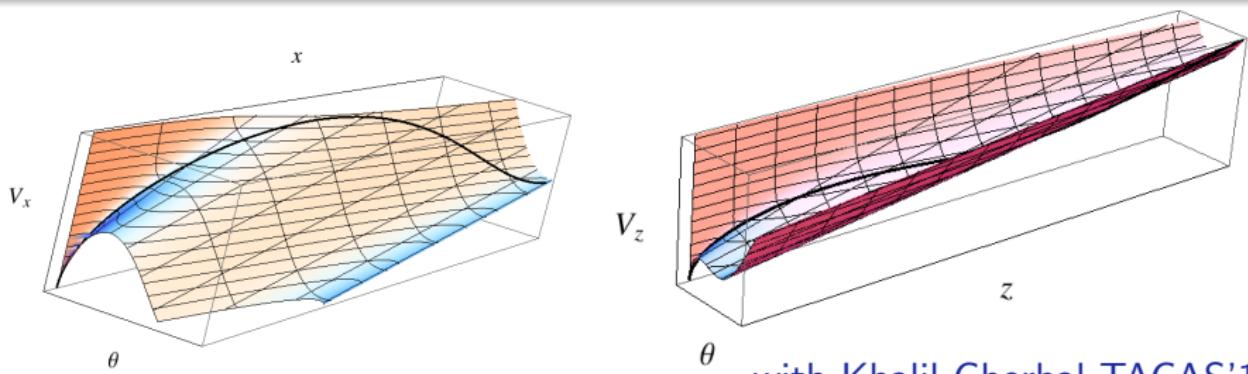


X : thrust along u Z : thrust along w M : thrust moment for w
 g : gravity m : mass I_{yy} : inertia second diagonal

with Khalil Ghorbal TACAS'14

Result (DRI Automatically Generates Invariant Functions)

$$\begin{aligned} \frac{Mz}{I_{yy}} + g\theta + \left(\frac{X}{m} - qw \right) \cos(\theta) + \left(\frac{Z}{m} + qu \right) \sin(\theta) \\ \frac{Mx}{I_{yy}} - \left(\frac{Z}{m} + qu \right) \cos(\theta) + \left(\frac{X}{m} - qw \right) \sin(\theta) \\ - q^2 + \frac{2M\theta}{I_{yy}} \end{aligned}$$

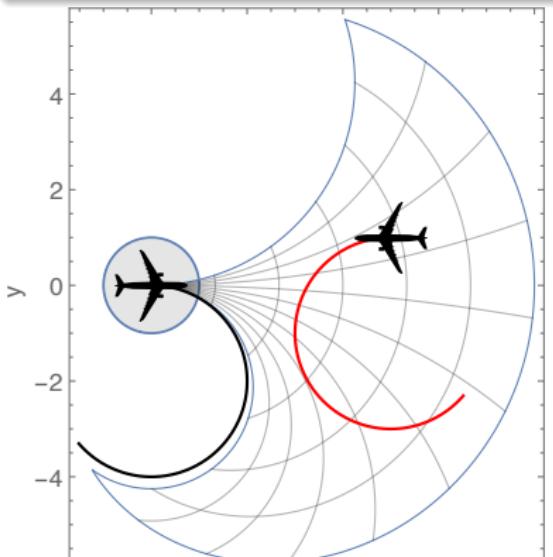


with Khalil Ghorbal TACAS'14

Result (DRI Automatically Generates Invariants)

$$\omega_1 = 0 \wedge \omega_2 = 0 \rightarrow v_2 \sin \vartheta x = (v_2 \cos \vartheta - v_1)y > p(v_1 + v_2)$$

$$\begin{aligned} \omega_1 \neq 0 \vee \omega_2 \neq 0 \rightarrow -\omega_1 \omega_2 (x^2 + y^2) + 2v_2 \omega_1 \sin \vartheta x + 2(v_1 \omega_2 - v_2 \omega_1 \cos \vartheta)y \\ + 2v_1 v_2 \cos \vartheta > 2v_1 v_2 + 2p(v_2 |\omega_1| + v_1 |\omega_2|) + p^2 |\omega_1 \omega_2| \end{aligned}$$

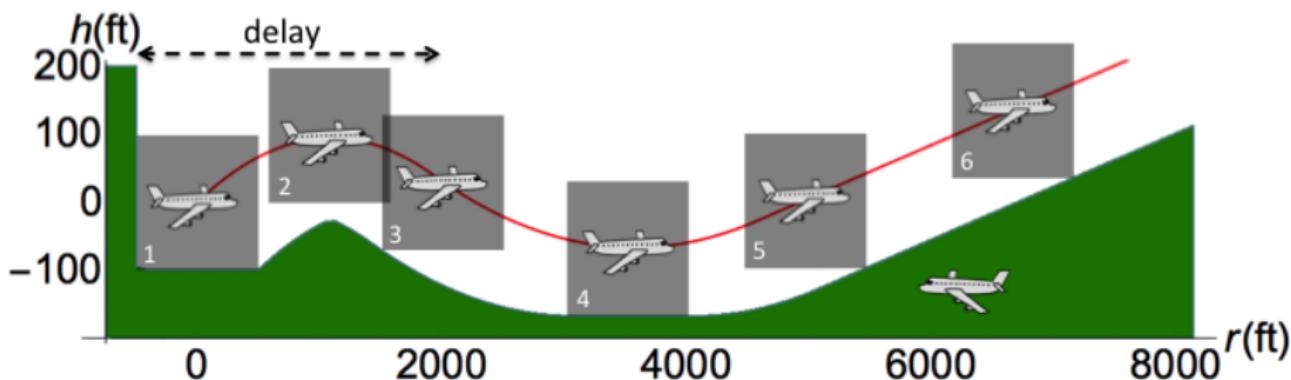


7 Differential Radical Invariants

- Differential Radical Invariants

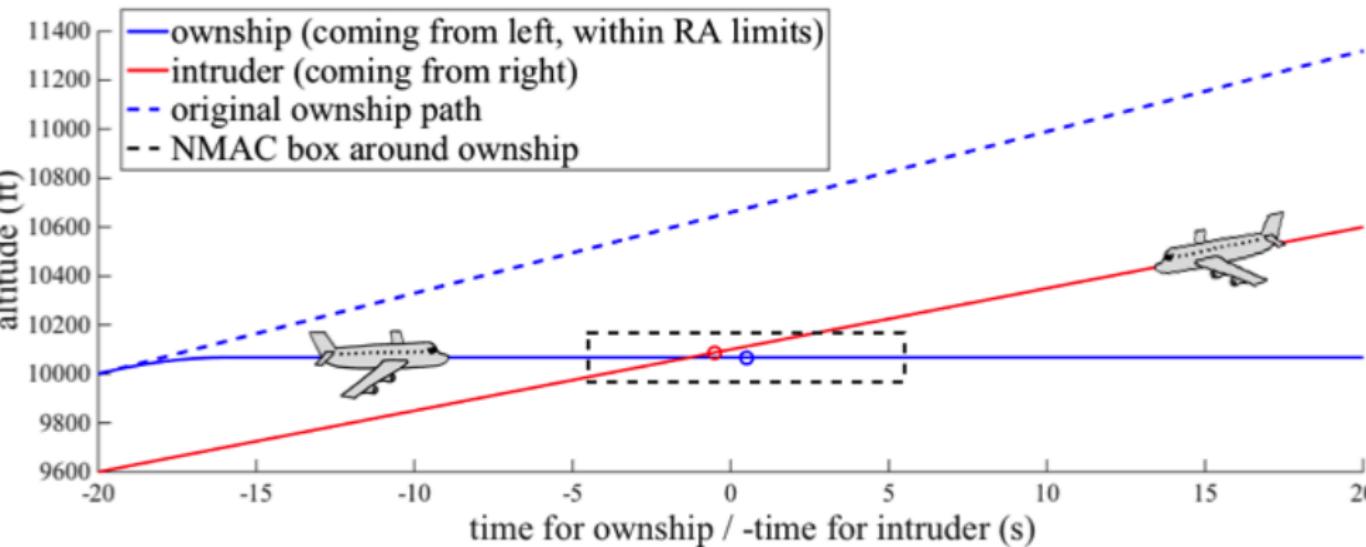
8 ACAS X

- Developed by the FAA to replace current TCAS in aircraft
- Approximately optimizes Markov Decision Process on a grid
- Advisory from lookup tables with numerous 5D interpolation regions



- ① Identified safe region for each advisory symbolically
- ② Proved safety for hybrid systems flight model in KeYmaera

ACAS X table comparison shows safe advisory in 97.7% of the 648,591,384,375 states compared (15,160,434,734 counterexamples).



ACAS X issues DNC advisory, which induces collision unless corrected