



MODELING AND FORMAL VERIFICATION OF VEHICLE PLATOONING SYSTEM

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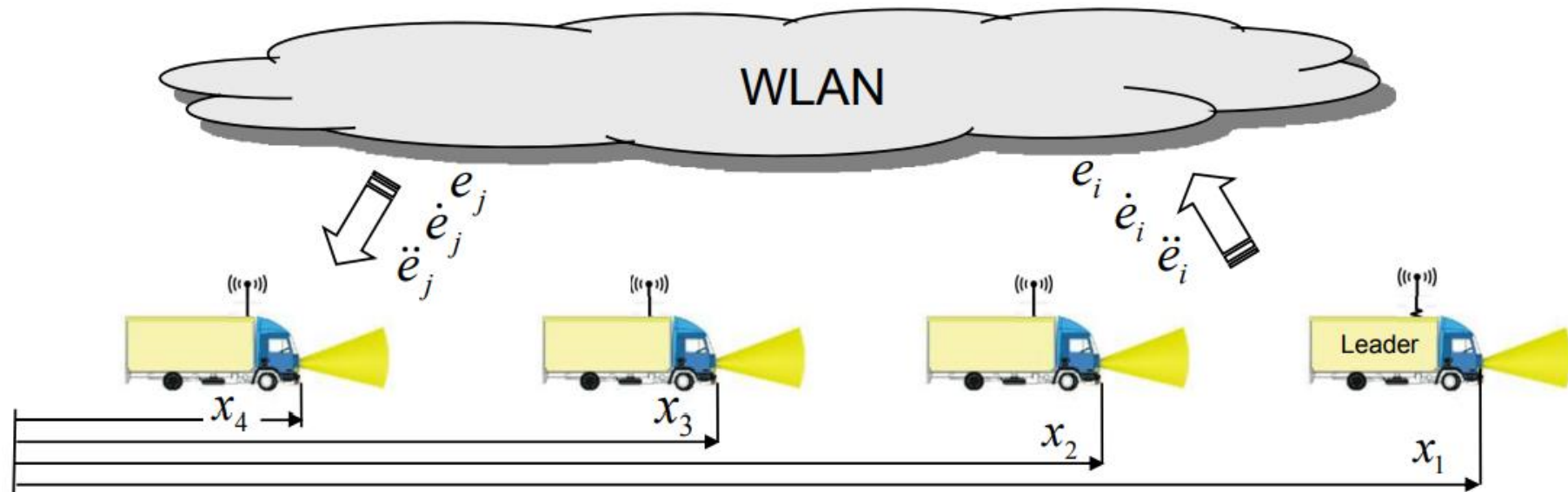
Outline

- Introduction
- Background
- System Model
- Verification
- Conclusion



Introduction

- The operation of group of vehicles at small inter-vehicular distances is known as **vehicle platooning**.



○ Introduction

- Need for platooning?



Some studies show driving heavy-vehicles in a platoon **reduces** aerodynamic drag and **reduces** fuel consumption by up to **10%**.



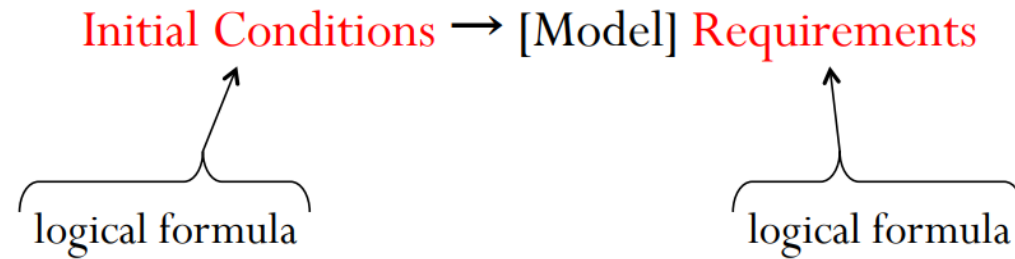
○ At a high level

- We take a ***cyber-physical*** systems approach to model and verify such a system.
- Building mathematical models of dynamical systems characterized by multiple facets like **discrete**, **continuous**, **adversarial**, **non-determinism**, and **stochastic**.
- Formally verify these models using **mathematical proof theory** and **axiomatization**.



○ Background

- Differential Dynamic Logic (dL)



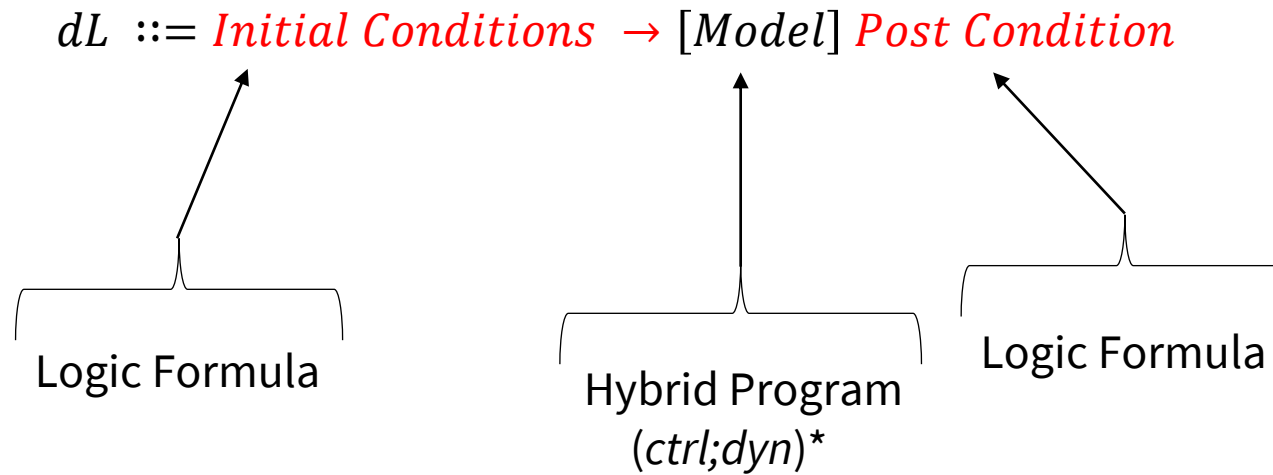
$\phi ::= \theta_1 \sim \theta_2 \mid \neg\phi \mid \phi \wedge \psi \mid \forall x\phi \mid \exists x\phi \mid [\alpha]\phi \mid \langle\alpha\rangle\phi$



○ Background

- Hybrid Program (HP)

$$\alpha, \beta ::= x := e \mid ?Q \mid x' = f(x) \& Q \mid \alpha \cup \beta \mid \alpha; \beta \mid \alpha^*$$



○ Background

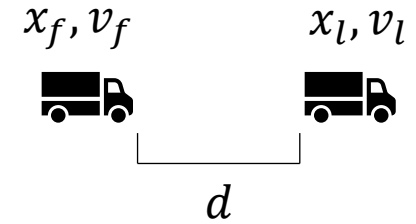
Statement	Effect
$\alpha; \beta$	sequential composition, first performs α and then β afterwards
$\alpha \cup \beta$	nondeterministic choice, following either α or β
α^*	nondeterministic repetition, repeating α $n \geq 0$ times
$x := \theta$	discrete assignment of the value of term θ to variable x (jump)
$x := *$	nondeterministic assignment of an arbitrary real number to x
$(x'_1 = \theta_1, \dots, x'_n = \theta_n \ \& \ F)$	continuous evolution of x_i along differential equation system $x'_i = \theta_i$, restricted to maximum domain or invariant region F
$?F$	check if formula F holds at current state, abort otherwise
$\text{if}(F) \text{ then } \alpha \text{ else } \beta$	perform α if F holds, perform β otherwise



System Model

- Two Vehicle Highway Platoon

Lead Vehicle: l , Follower Vehicle: f



$$x_l - x_f \geq d$$

$$x' = v, v' = a, t' = 1$$

$$A \geq 0$$

$$B \geq b > 0$$



System Model

$$hp \equiv (ctrl; dyn)^*$$

$$ctrl \equiv l_{ctrl} || f_{ctrl};$$

$$l_{ctrl} \equiv (a_l := *; ?(-B \leq a_l \leq A))$$

$$f_{ctrl} \equiv (a_f := *; ?(-B \leq a_l \leq A))$$

$$\cup (? \mathbf{Safe}_\delta; a_f := *; ?(-B \leq a_l \leq A))$$

$$\cup (? (v_f = 0); a_f := 0)$$

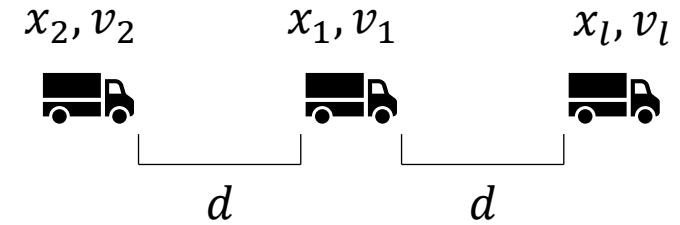
$$\mathbf{Safe}_\delta \equiv x_f + \frac{v_f^2}{2b} + \left(\frac{A}{b} + 1\right) \left(\frac{A}{2} \delta^2 + \delta v_f\right) < x_l + \frac{v_l^2}{2B}$$

$$dyn \equiv (t := 0; x'_f = v_f, v'_f = a_f, x'_l = v_l, v'_l = a_l, \\ v_f \geq 0 \wedge v_l \geq 0 \wedge t \leq \delta)$$



System Model

- Three Vehicle Highway Platoon



Lead Vehicle: l , Follower Vehicle 1: f_1 , Follower Vehicle 2: f_2

$$x_l - x_1 \geq d, x_1 - x_2 \geq d$$

$$x' = v, v' = a, t' = 1$$

$$A \geq 0$$

$$B \geq b > 0$$



System Model

$$hp \equiv (ctrl; dyn)^*$$

$$ctrl \equiv l_{ctrl} || f_{ctrl1} || f_{ctrl2};$$

$$l_{ctrl} \equiv (a_l := *; ?(-B \leq a_l \leq A))$$

$$f_{ctrl1} \equiv (a_1 := *; ?(-B \leq a_l \leq A))$$

$$\cup (?Safe_\delta; a_1 := *; ?(-B \leq a_l \leq A))$$

$$\cup (? (v_1 = 0); a_1 := 0)$$

$$f_{ctrl2} \equiv (a_2 := *; ?(-B \leq a_1 \leq A))$$

$$\cup (?Safe_\delta; a_2 := *; ?(-B \leq a_1 \leq A))$$

$$\cup (? (v_2 = 0); a_2 := 0)$$

$$Safe_\delta \equiv x_1 + \frac{v_1^2}{2b} + (\frac{A}{b} + 1)(\frac{A}{2}\delta^2 + \delta v_1) < x_l + \frac{v_l^2}{2B}$$

$$Safe_\delta \equiv x_2 + \frac{v_2^2}{2b} + (\frac{A}{b} + 1)(\frac{A}{2}\delta^2 + \delta v_2) < x_1 + \frac{v_1^2}{2B}$$

$$dyn \equiv (t := 0; x'_2 = v_2, v'_2 = a_2, x'_1 = v_1, v'_1 = a_1,$$

$$x'_l = v_l, v'_l = a_l v_1 \geq 0 \wedge v_2 \geq 0 \wedge v_l \geq 0 \wedge t \leq \delta)$$



○ Verification

To formally verify we use **axioms**, **proof rules**, and **theorems**.

eg. Godel's Generalization Rule, Tarski's Quantifier Elimination Rule, Sequent Calculi, etc.

Can be proved using software tools like **KeYmaera X**, **Hal**, etc.





Verification

TwoVehiclesLinear

New proof

Edit



```
1 Theorem "TwoVehiclesLinear"
2
3 Definitions
4   Real A;
5   Real B;
6   Real b;
7   Real td;
8   Real d;
9 End.
10
11 ProgramVariables
12   Real x1;
13   Real v1;
14   Real a1;
15
16   Real xf;
17   Real vf;
18   Real af;
19
20   Real t;
21 End.
22
23
24 Problem
25   /* INITIAL CONDITIONS */
26   (xf < x1 & x1 - xf >= d & x1 > xf + (vf^2)/(2*b) + (A/b + 1)*((A/2)*(td^2) + td*vf) - (v1^2)/(2*b) & B >= b & b > 0 & vf >= 0 & v1 >= 0 & A >= 0 & td >= 0)
27   ->
28   [
29     {
30       /*CONTROL*/
31       {
32         {a1 := *; ?(-B <= a1 & a1 <= A);}
33         {af := *; ?(-B <= af & af <= A); ++ ?(x1 > xf + (vf^2)/(2*b) + (A/b + 1)*((A/2)*(td^2) + td*vf) - (v1^2)/(2*b)); af := *; ?(-B <= af & af <= A); ++ ?vf = 0; af := 0;} /*FOLLOWER*/
34       }
35       t := 0;
36       /*CONTINUOUS DYNAMICS*/
37       {
38         {x1' = v1, v1' = a1, xf' = vf, vf' = af, t' = 1 & v1 >= 0 & vf >= 0 & t <= td }
39       }
40     } @invariant(xf < x1 & x1 - xf >= d & xf + (vf^2)/(2*b) + (A/b + 1)*((A/2)*(td^2) + td*vf) < x1 + (v1^2)/(2*B) & vf >= 0 & v1 >= 0)
41
42   ](xf < x1 & x1 - xf >= d & xf + (vf^2)/(2*b) + (A/b + 1)*((A/2)*(td^2) + td*vf) < x1 + (v1^2)/(2*B) & vf >= 0 & v1 >= 0)
43
```





Verification

ThreeVehiclesLinear

New proof

Edit



```
1 Theorem "ThreeVehiclesLinear"
2
3 Definitions
4   Real A;
5   Real B;
6   Real b;
7   Real td;
8   Real d;
9 End.
10
11 ProgramVariables
12   Real x1;
13   Real v1;
14   Real a1;
15
16   Real x1;
17   Real v1;
18   Real a1;
19
20   Real x2;
21   Real v2;
22   Real a2;
23
24   Real t;
25 End.
26
27
28 Problem
29   /* INITIAL CONDITIONS */
30   (x2 < x1 & x1 - x2 >= d & x1 < x1 & x1 - x1 >= d & x1 > x2 + (v1^2)/(2*b) + (A/b + 1)*((A/2)*(td^2) + td*v2) - (v1^2)/(2*b) & x1 > x1 + (v1^2)/(2*b) + (A/b + 1)*((A/2)*(td^2) + td*v1) - (
31   ->
32   [
33   {
34     /*CONTROL*/
35     {
36       {a1 := *; ?(-B <= a1 & a1 <= A);}
37       {a1 := *; ?(-B <= a1 & a1 <= A); ++ ?(x1 > x1 + (v1^2)/(2*b) + (A/b + 1)*((A/2)*(td^2) + td*v1) - (v1^2)/(2*b)); a1 := *; ?(-B <= a1 & a1 <= A); ++ ?v1 = 0; a1 := 0;} /*FOLLOWER
38       {a2 := *; ?(-B <= a2 & a2 <= A); ++ ?(x1 > x2 + (v2^2)/(2*b) + (A/b + 1)*((A/2)*(td^2) + td*v2) - (v1^2)/(2*b)); a2 := *; ?(-B <= a2 & a2 <= A); ++ ?v2 = 0; a2 := 0;} /*FOLLOWER
39     }
40     t := 0;
41     /*CONTINUOUS DYNAMICS*/
42     {
43
```





Verification

KeYmaera X

Theme Help

TwoVehiclesLinear: ... Auto Prop QE CEX Unfold Simplify Undo Edit Browse Defs Propositional Quantifier Hybrid Program Differential Equation Tools

Init » QE CEX : auto Step » $af(t_{-}^2/2) : \wedge R$ Step » $al(t_{-}^2/2) : \wedge R$ Step » $af(t_{-}^2/2) : \wedge R$ Step » $af(t_{-} + vf) : \wedge R$ Step » $[?vf=0; af:=0;] : \wedge R$ Step » $af(t_{-}^2/2) : \wedge R$ Step » $af(t_{-}^2/2) : \wedge R$

Hint: composeb | GV | MR | chaseAt |

\vdash

$x_f < x_l \wedge$
 $x_l - x_f \geq d \wedge$
 $x_f + vf^2 / (2 * b) +$
-1: $(A / b + 1) * (A / 2 * td^2 + td * vf) <$
 $x_l + vl^2 / (2 * B) \wedge$
 $vf \geq 0 \wedge vl \geq 0$
-2: $B \geq b$
-3: $b > 0$
-4: $A \geq 0$
-5: $td \geq 0$
-6: $-B \leq al \wedge al \leq A$

$[?vf = 0; af := 0;]$
 $\forall t_{-}$
(
 $t_{-} \geq 0 \rightarrow$
 $\forall s_{-}$
(
 $0 \leq s_{-} \wedge s_{-} \leq t_{-} \rightarrow$
 $al * s_{-} + vl \geq 0 \wedge af * s_{-} + vf \geq 0 \wedge s_{-} + 0 \leq td$
) \rightarrow
 $af * (t_{-}^2 / 2) + vf * t_{-} + x_f < al * (t_{-}^2 / 2) + vl * t_{-} + x_l \wedge$
 $al * (t_{-}^2 / 2) + vl * t_{-} + x_l - (af * (t_{-}^2 / 2) + vf * t_{-} + x_f) \geq d \wedge$
 $af * (t_{-}^2 / 2) + vf * t_{-} + x_f + (af * t_{-} + vf)^2 / (2 * b) +$
 $(A / b + 1) * (A / 2 * td^2 + td * (af * t_{-} + vf)) <$
 $al * (t_{-}^2 / 2) + vl * t_{-} + x_l + (al * t_{-} + vl)^2 / (2 * B) \wedge$
 $af * t_{-} + vf \geq 0 \wedge al * t_{-} + vl \geq 0$
)

$\wedge R$

Tactic Rule andR

$\wedge R$ $\Gamma \vdash P, \Delta$ $\Gamma \vdash P \wedge Q, \Delta$ $\Gamma \vdash Q, \Delta$



○ Conclusion & Future Work

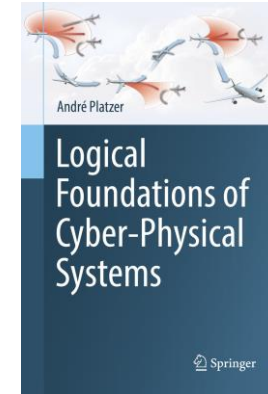
- Formally proven the **linear** platoon models.
- Vehicle dynamics such as **non-linear path, computation latency, drag**, etc. Need to be incorporated.
- Can also be modeled using **state-space analysis (automata theory)** using softwares like LabView, Simulink, Hsolver, etc.
- Control optimizations like **Model Predictive Control (MPC)** which work well with machine perception.



○ Annexure

- Logical Foundations of Cyber-Physical Systems by A. Platzer

<https://lfcps.org/lfcps/>



- KeYmaera X: An aXiomatic Tactical Theorem Prover for Hybrid Systems

<https://keymaerax.org/>





Questions?





Thank You!

