

Séminaire LoVe

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Lightweight (yet efficient) verification of cyber-physical systems

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Joint work with Masaki Waga and Ichiro Hasuo

Outline

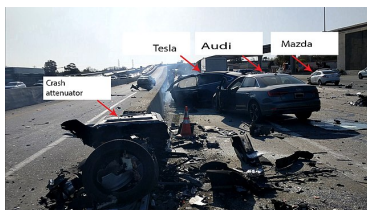
- 1 Motivation
- 2 Model-bounded monitoring
- 3 Experiments
- 4 Conclusions

Context : safety-critical cyber-physical systems



Images illustrating Tesla fatal crashes : Williston, Florida, USA [May 7, 2016]; Mountain View, California, USA [March 23, 2018]

Context : safety-critical cyber-physical systems



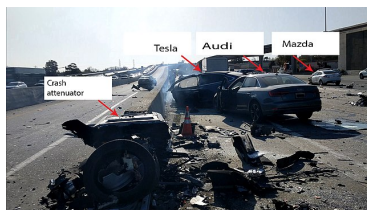
Images illustrating Tesla fatal crashes : Williston, Florida, USA [May 7, 2016]; Mountain View, California, USA [March 23, 2018]

Formal verification of complex cyber-physical systems : **out of reach?**

Lightweight verification

- Testing
- Monitoring, runtime verification

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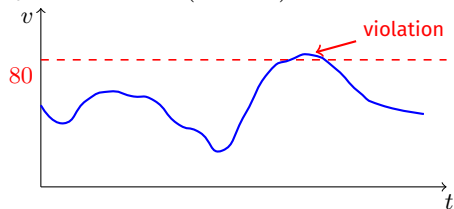
Formal verification of complex cyber-physical systems : **out of reach?**

Lightweight verification

- Testing
- **Monitoring**, runtime verification

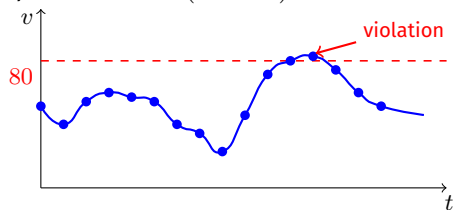
Monitoring cyber-physical systems

Specification : $\neg(v > 80)$



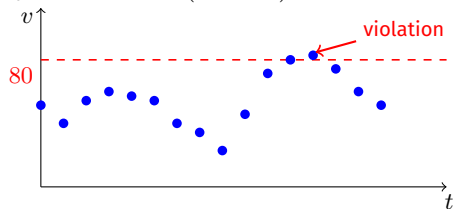
Monitoring cyber-physical systems with sampling

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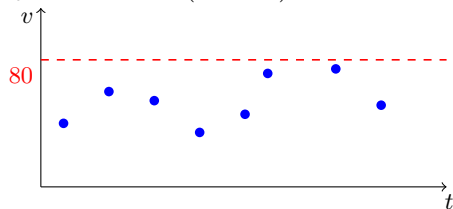
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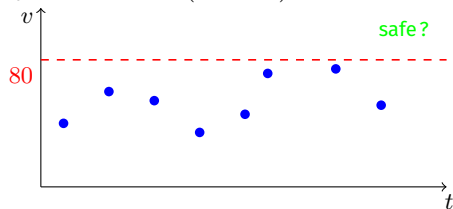
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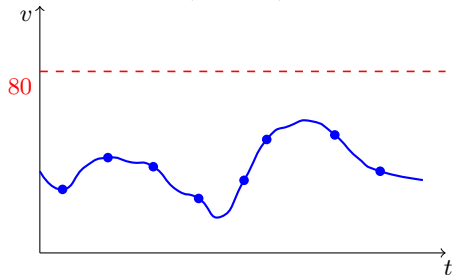
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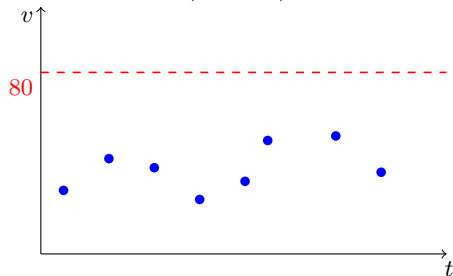
Signal interpolation

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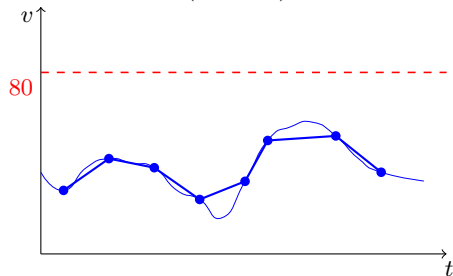
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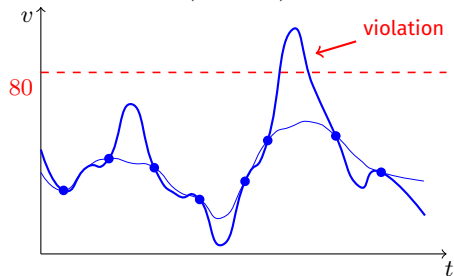
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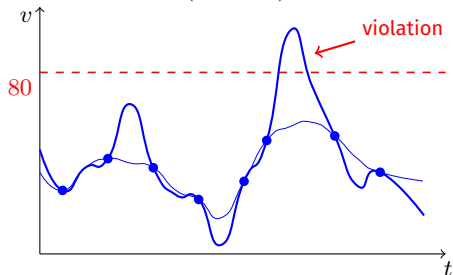
Signal interpolation

Specification : $\neg(v > 80)$



Signal interpolation with prior knowledge

Specification : $\neg(v > 80)$



Impossible violation because we **know** that $\frac{dv}{dt} < K$ (for some known K)

Example : a car **cannot accelerate arbitrarily fast**

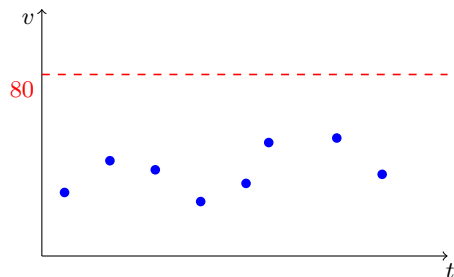
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- 2 Model-bounded monitoring**
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Model-bounded monitoring [WAH21]

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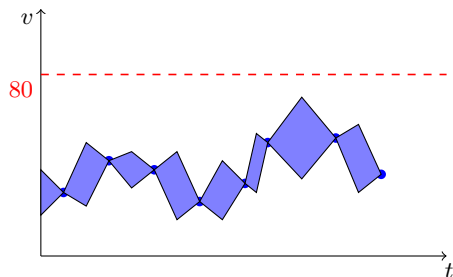
System log



Model-bounded monitoring [WAH21]

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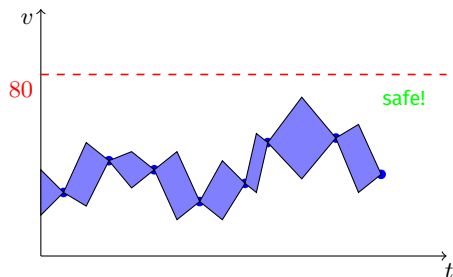
System log + knowledge (bounded model) ($\frac{dv}{dt} < K$)



Model-bounded monitoring [WAH21]

Specification : $\neg(v > 80)$

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The bounding model : a linear hybrid automaton

A bounding model should :

- 😊 be expressive
- 😊 yet allow for efficient computation

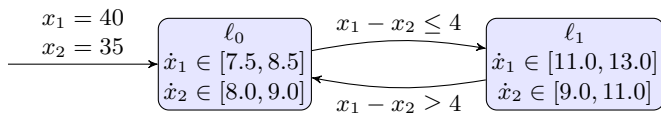
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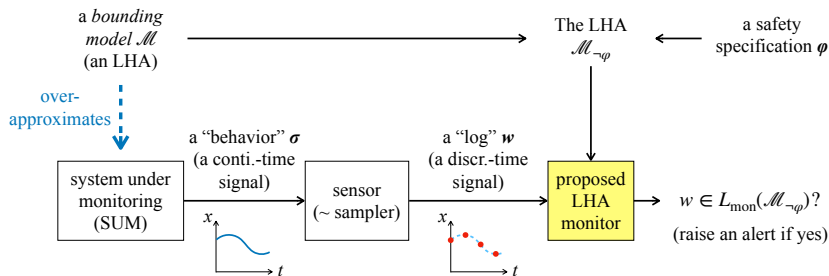
Our formalism : **linear hybrid automata** [Hen96]

- discrete modes
- invariants, guards, derivatives expressed by **polyhedra**

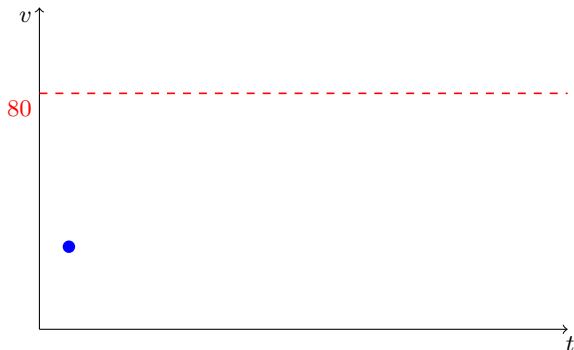


• [Hen96] Thomas A. HENZINGER. « The Theory of Hybrid Automata ». In : *LICS*. IEEE Computer Society, 1996, p. 278-292

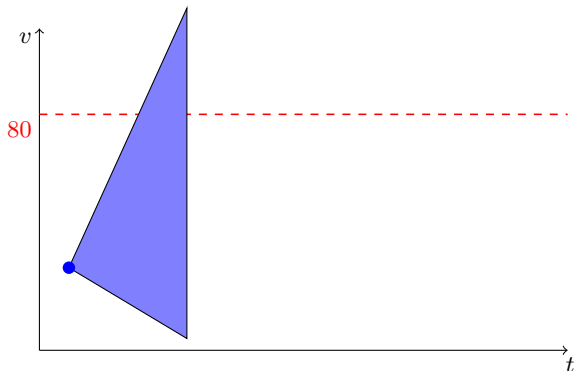
Model-bounded monitoring in a nutshell



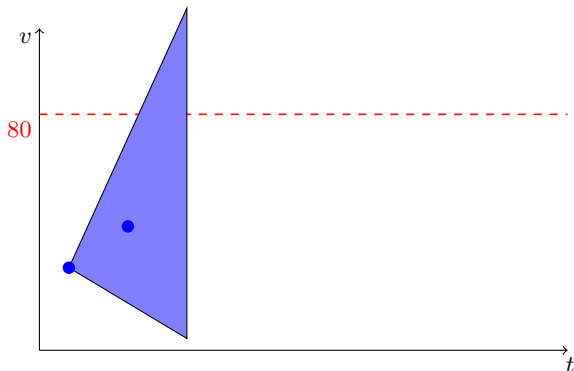
Algorithm : bounded-time reachability



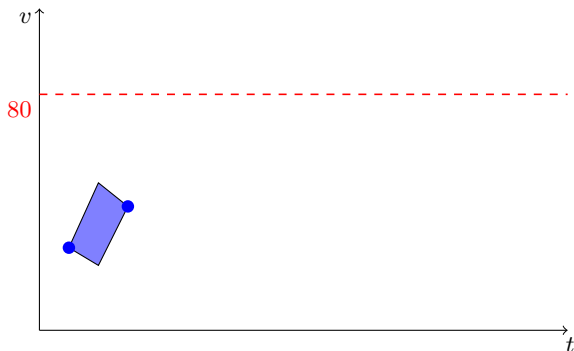
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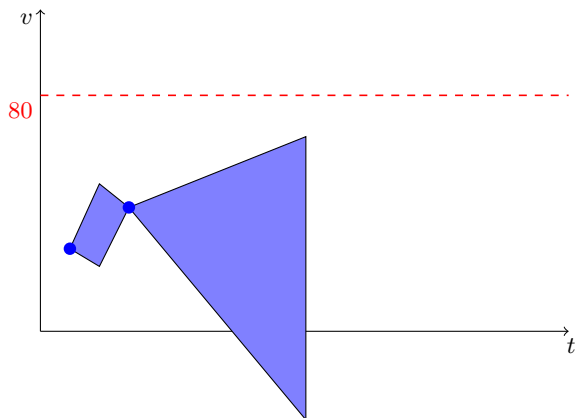
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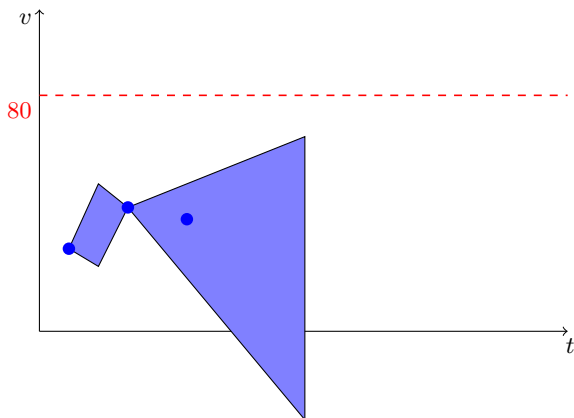
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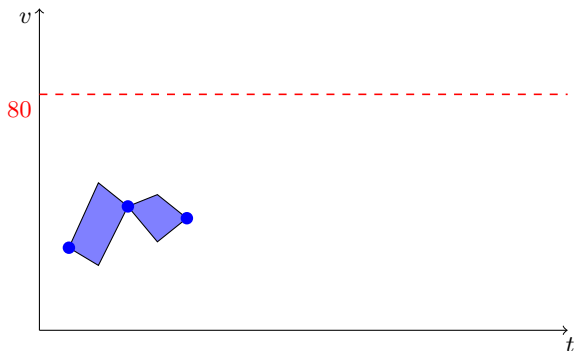
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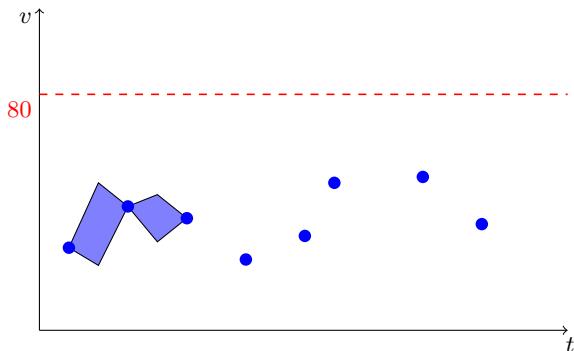
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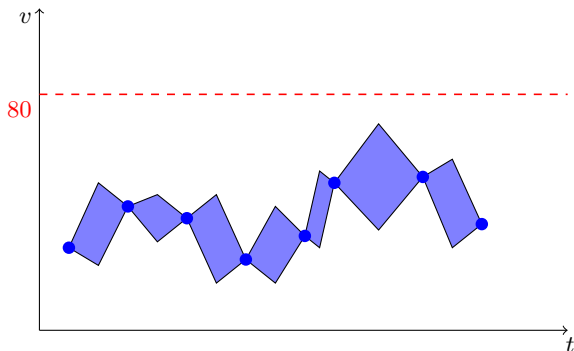
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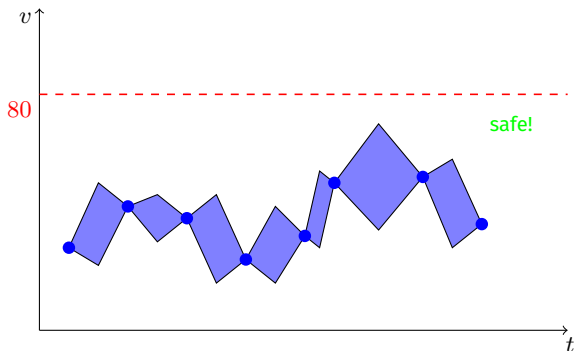
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Algorithm : bounded-time reachability



Are linear hybrid automata efficient?

- ☹ Reachability analysis in (linear) hybrid automata is **very hard**
 - Long line of research (e. g., [Bu+19][Bog+20])

-
- [Bu+19] [Lei BU, Jiawan WANG, Yuming WU et Xuandong LI](#). « From Bounded Reachability Analysis of Linear Hybrid Automata to Verification of Industrial CPS and IoT ». In : *SETSS*. T. 12154. LNCS. Springer, 2019, p. 10-43
 - [Bog+20] [Sergiy BOGOMOLOV, Marcelo FORETS, Goran FREHSE, Kostiantyn POTOMKIN et Christian SCHILLING](#). « Reachability Analysis of Linear Hybrid Systems via Block Decomposition ». In : *IEEE Transactions on Computer-Aided Design of Integrated Circuits and Systems* 39.11 (2020), p. 4018-4029

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- 😊 But in our scheme we “**reset**” the uncertainty at each new sample
 - No error accumulation, no divergence

• [Bu+19] [Lei BU, Jiawan WANG, Yuming WU et Xuandong LI](#). « From Bounded Reachability Analysis of Linear Hybrid Automata to Verification of Industrial CPS and IoT ». In : *SETSS*. T. 12154. LNCS. Springer, 2019, p. 10-43

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Two implementations

Approach 1 : existing model-checker **PHAVerLite** [BZ19]

- Light fork of PHAVerLite [Fre08]
- 😊 Highly optimized reachability analysis

Approach 2 : *ad hoc* dedicated monitor **HAMONI** (by Masaki Waga)

- 😊 Best performance in theory

-
- [BZ19] Anna BECCHI et Enea ZAFFANELLA. « Revisiting Polyhedral Analysis for Hybrid Systems ». In : SAS. T. 11822. LNCS. Springer, 2019, p. 183-202
 - [Fre08] Goran FREHSE. « PHAVer : Algorithmic Verification of Hybrid Systems Past HyTech ». In : *International Journal on Software Tools for Technology Transfer* 10.3 (mai 2008), p. 263-279. ISSN : 1433-2779

Benchmarks

Three main benchmarks :

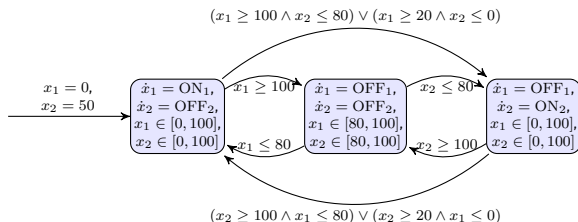
- 1 Adaptive cruise controller [BRS19]
- 2 Robot navigation benchmark [Flo4]
- 3 Shared Gas-Burner [DHR05]

-
- [BRS19] [Lei BU, Rajarshi RAY et Stefan SCHUPP](#). « ARCH-COMP19 Category Report : Bounded Model Checking of Hybrid Systems with Piecewise Constant Dynamics ». In : *ARCH@CPSIoTWeek*. T. 61. EPiC Series in Computing. EasyChair, 2019, p. 120-128
 - [Flo4] [Ansgar FEHNKER et Franjo IVANCIC](#). « Benchmarks for Hybrid Systems Verification ». In : *HSCC*. T. 2993. LNCS. Springer, 2004, p. 326-341
 - [DHR05] [Laurent DOYEN, Thomas A. HENZINGER et Jean-François RASKIN](#). « Automatic Rectangular Refinement of Affine Hybrid Systems ». In : *FORMATS*. T. 3829. LNCS. Springer, 2005, p. 144-161

Benchmarks : bounding models

Bounding models : mostly taken from the literature

■ Example : **GASBURNER** :

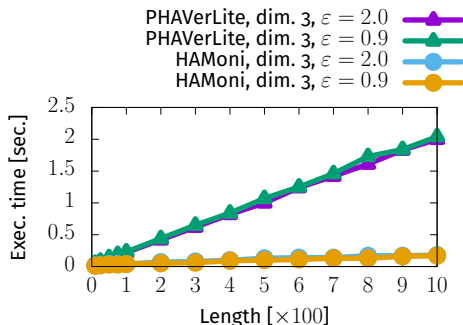


The affine hybrid automaton for the original model in **GASBURNER**, where $h = 2, a = 0.01, b = 0.005, \text{ON}_1 = h - ax_1 + bx_2, \text{ON}_2 = h - ax_2 + bx_1, \text{OFF}_1 = -ax_1 + bx_2, \text{and } \text{OFF}_2 = -ax_2 + bx_1$.

Logs : randomly generated from the bounding models (this coincidence is not mandatory)

■ Length of the logs : 150 to 100,000

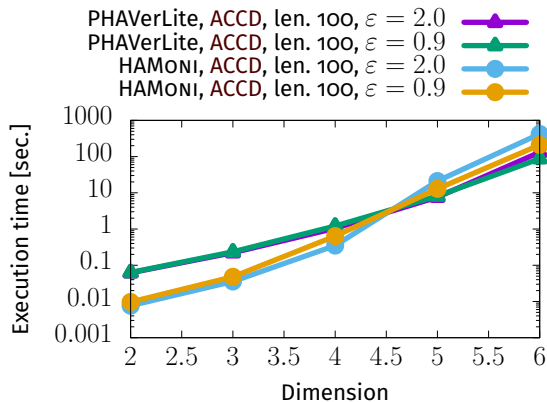
Changing observation length



Conclusions :

- linear
- very scalable : $> 5,000$ samples / second
- Our tool HAMONI is about 10 times faster than the existing PHAVerLite

Changing model dimension



Conclusions :

- Existing model checker PHAVerLite faster for dimensions > 6
- Future work : further optimization of our tool HAMONI

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Conclusion

Model-bounded monitoring

- Bounding model (prior knowledge) : **linear hybrid automaton**

Algorithms and implementations

- Idea : bounded-time reachability
- Crux : no error accumulation due to new sampling
- Experiments : **effectively monitorable**

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Joint patent : NII (Japan) + Université de Lorraine (France)

Perspectives

- Monitoring beyond safety
 - Monitoring against **temporal properties**
- **Uncertainties** in the observation
 - partial logs
 - values known with uncertainties
- **Uncertainty** in the specification
 - **Timing parameters**
- **Quantitative** monitoring
 - “By how much is the specification violated?”

Bibliography

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Additional information

Benchmarks

ϵ : slow-down parameter

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