

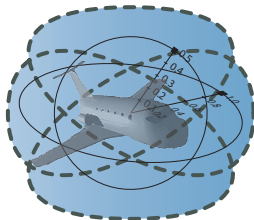
15-819/18-879: Logical Analysis of Hybrid Systems

01: Hybrid Systems Applications

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1 Hybrid Systems Applications

- Air Traffic Control
- Hybrid Systems / Cyber-Physical Systems
- Train Control
- Car Control
- UAV
- Chemical/Physical Process Control
- Biomedical Applications
- Advanced Chip Design

How can we build computerized controllers for physical systems that are guaranteed to meet their design goals?

- Hybrid systems
- Logical analysis
- Symbolic / numerical techniques
- Automatic theorem proving
- Model checking
- Verification
- Balance theory, practice & applications
- 30% Homework, 15% Midterm, 55% Project
- Project: Theory and/or implementation and/or application
- Whitepaper (4p), proposal (10p), report



- 1 Safety-critical complex physical systems
- 2 Dynamical systems: discrete, continuous, hybrid
- 3 Controllability, safety & stability
- 4 First-order logic and first-order real arithmetic
- 5 Symbolic reachability analysis
- 6 Hybrid programs and hybrid automata
- 7 Dynamic logic & dynamical systems, differential dynamic logic
- 8 Differential variance and invariance
- 9 Differential-algebraic equations and differential algebra
- 10 Differential transformations and differential reductions
- 11 Railway control applications
- 12 Air traffic control applications
- 13 Distributed car control applications



- Differential equations



- Differential equations (Peano, Picard-Lindelöf, Cauchy-Lipschitz)



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- First-order logic



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- Differential equations (Peano, Picard-Lindelöf, Cauchy-Lipschitz)
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- Deduction & formal proofs
- Model checking
- Quantifier elimination

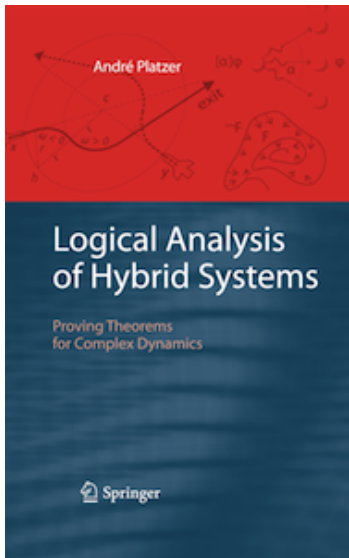
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- Computer algebra





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Logical Analysis of Hybrid Systems.

Springer, 426p., 2010.

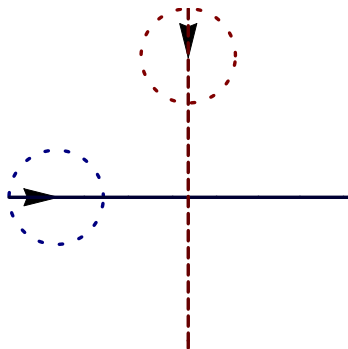
ISBN 978-3-642-14508-7.

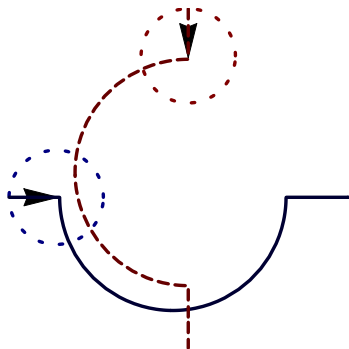
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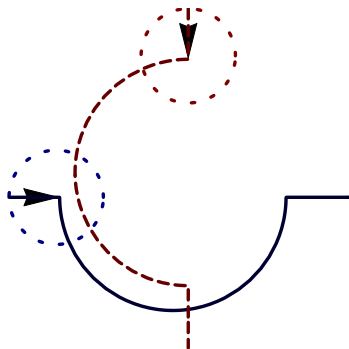


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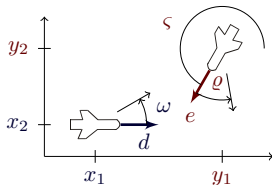
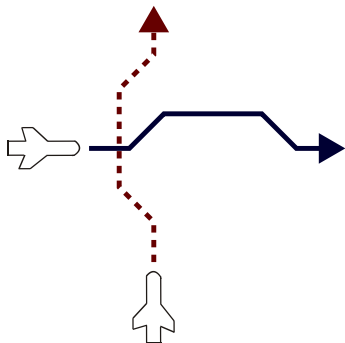






Hybrid Systems

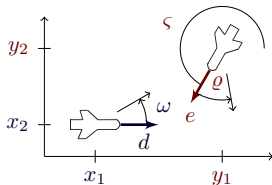
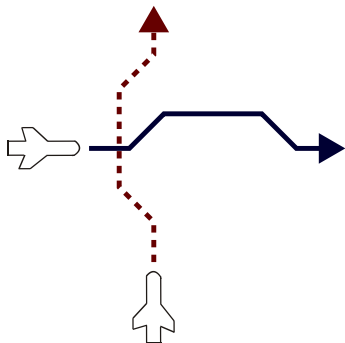
interacting discrete and continuous dynamics



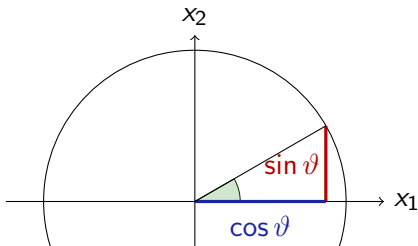
$$\begin{bmatrix} x_1' = v \cos \vartheta & y_1' = u \cos \varsigma \\ x_2' = v \sin \vartheta & y_2' = u \sin \varsigma \end{bmatrix}$$

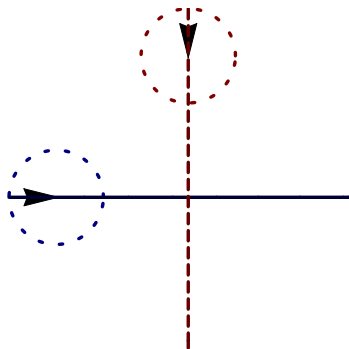
Hybrid Systems

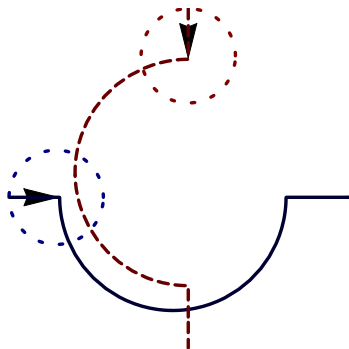
interacting discrete and continuous dynamics

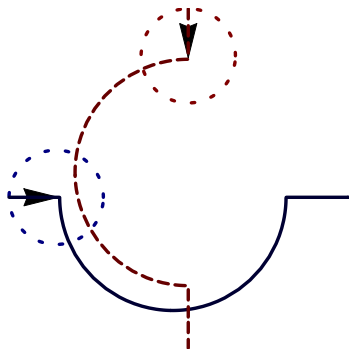


$$\begin{bmatrix} x'_1 = v \cos \vartheta & y'_1 = u \cos \varsigma \\ x'_2 = v \sin \vartheta & y'_2 = u \sin \varsigma \end{bmatrix}$$



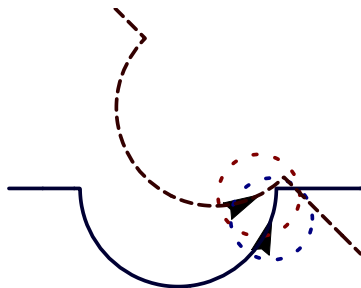
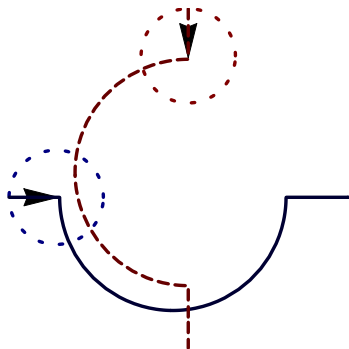






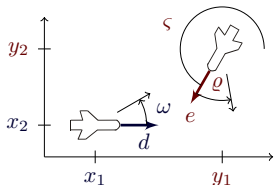
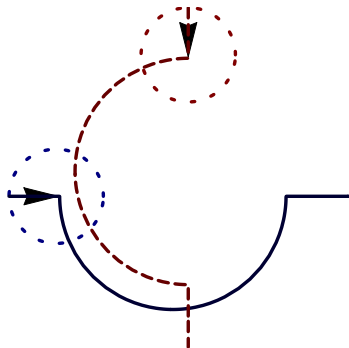
Verification?

looks correct



Verification?

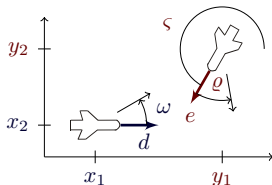
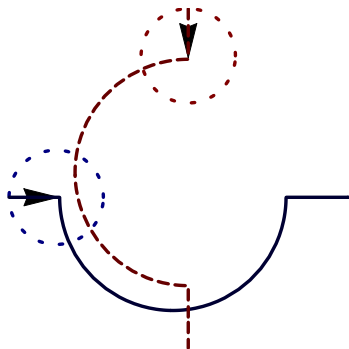
looks correct **NO!**



$$\begin{bmatrix} x_1' = -v + u \cos \vartheta + \omega x_2 \\ x_2' = u \sin \vartheta - \omega x_1 \\ \vartheta' = \varpi - \omega \end{bmatrix}$$

Verification?

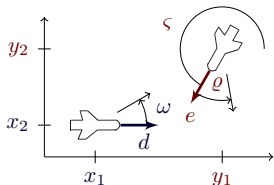
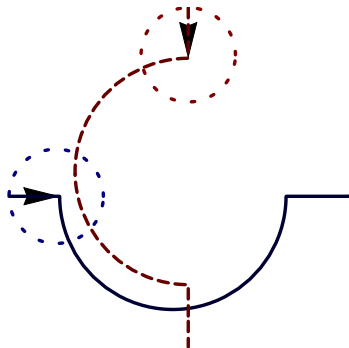
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$$\begin{bmatrix} x_1' = -v + u \cos \vartheta + \omega x_2 \\ x_2' = u \sin \vartheta - \omega x_1 \\ \vartheta' = \varpi - \omega \end{bmatrix}$$

Example (“Solving” differential equations)

$$\begin{aligned} x_1(t) = & \frac{1}{\omega \varpi} (x_1 \omega \varpi \cos t\omega - u\omega \cos t\omega \sin \vartheta + u\omega \cos t\omega \cos t\varpi \sin \vartheta - v\varpi \sin t\omega \\ & + x_2 \omega \varpi \sin t\omega - u\omega \cos \vartheta \cos t\varpi \sin t\omega - u\omega \sqrt{1 - \sin^2 \vartheta} \sin t\omega \\ & + u\omega \cos \vartheta \cos t\omega \sin t\varpi + u\omega \sin \vartheta \sin t\omega \sin t\varpi) \dots \end{aligned}$$



$$\begin{bmatrix} x_1' = -v + u \cos \vartheta + \omega x_2 \\ x_2' = u \sin \vartheta - \omega x_1 \\ \vartheta' = \varpi - \omega \end{bmatrix}$$

Example (“Solving” differential equations)

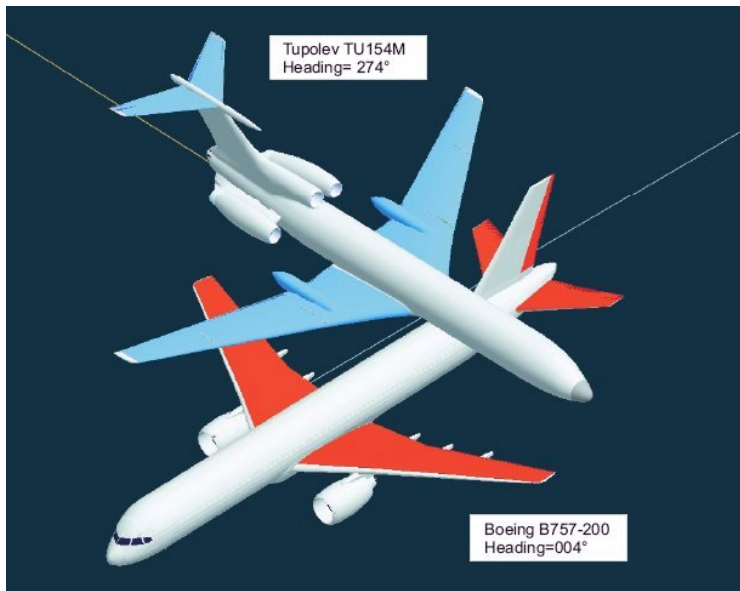
$$\forall t \geq 0 \quad \frac{1}{\omega \varpi} \left(x_1 \omega \varpi \cos t\omega - u\omega \cos t\omega \sin \vartheta + u\omega \cos t\omega \cos t\varpi \sin \vartheta - v\varpi \sin t\omega \right. \\ \left. + x_2 \omega \varpi \sin t\omega - u\omega \cos \vartheta \cos t\varpi \sin t\omega - u\omega \sqrt{1 - \sin^2 \vartheta} \sin t\omega \right. \\ \left. + u\omega \cos \vartheta \cos t\omega \sin t\varpi + u\omega \sin \vartheta \sin t\omega \sin t\varpi \right) \dots$$



- Human at ATC detected conflict
- Human instructed Tupolev to descend
- TCAS instructed Tupolev to climb and Boeing to descend
- Boeing couldn't notify human (busy)
- Pilots on both aircraft descended
- Mid-air collision (less than a minute after conflict detected)



Mid-air Collision at Überlingen, Germany 2002





Mathematical model for complex physical systems:

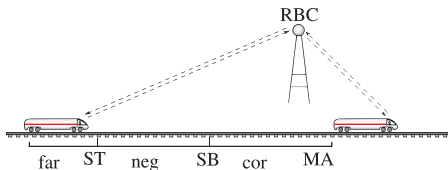
Definition (Hybrid Systems)

systems with interacting discrete and continuous dynamics

Technical characteristics:

Definition (Cyber-Physical Systems)

(Distributed network of) computerized control for physical system



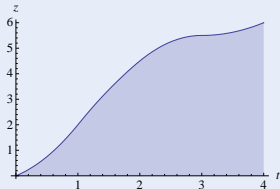
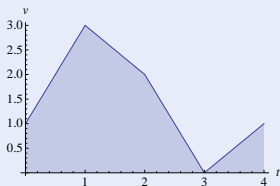
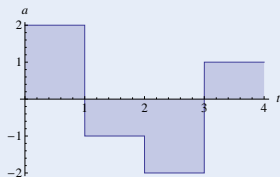
ETCS objectives:

- 1 Collision free
- 2 Maximise throughput & velocity (320 km/h = 200 mph)
- 3 $2.1 * 10^6$ passengers/day

Challenge

Hybrid systems

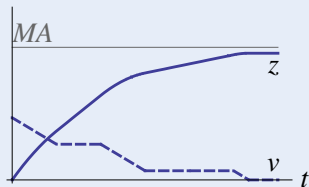
- Continuous dynamics (differential equations)
- Discrete dynamics (control decisions)



Challenge

Hybrid systems

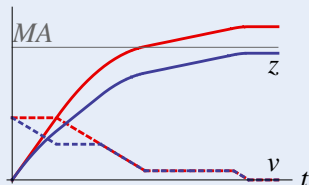
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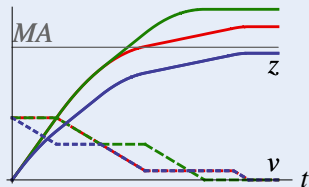
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Hybrid systems

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Challenge

Hybrid systems

- Continuous dynamics (differential equations)
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1 More than computers:



no `NullPointerException` \nrightarrow safe

Challenge

Hybrid systems

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



① More than computers:

no `NullPointerException` \nrightarrow safe

② More than physics:

braking control $v^2 \leq 2b(MA - z)$ \nrightarrow safe

Challenge

Hybrid systems

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



- 1 More than computers:
- 2 More than physics:
- 3 Joint dynamics requires:

no `NullPointerException` \nrightarrow safe
 braking control $v^2 \leq 2b(MA - z)$ \nrightarrow safe

$$SB \geq \frac{v^2}{2b} + \frac{a^2 \varepsilon^2}{2b} + \frac{a}{b} \varepsilon v + \frac{a}{2} \varepsilon^2 + \varepsilon v \dots$$

Challenge

Hybrid systems

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



Challenge

Hybrid systems

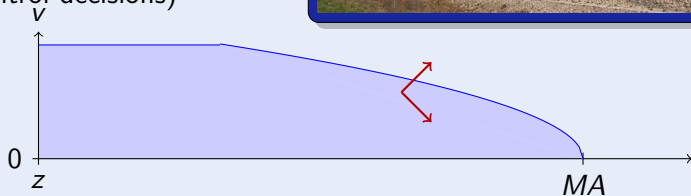
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Hybrid systems

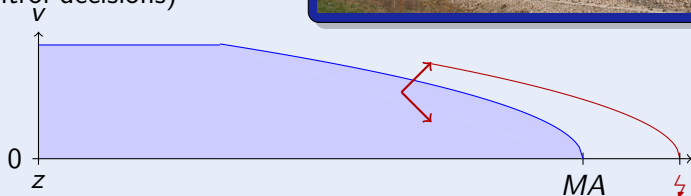
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Challenge

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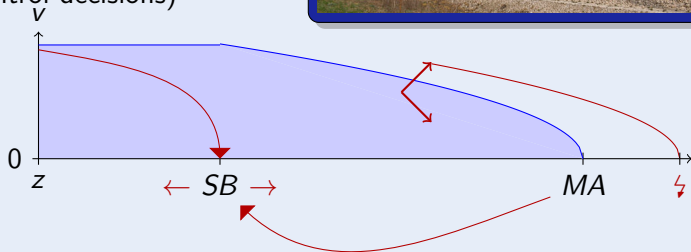
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$$SB \geq \frac{v^2}{2b} + \frac{a^2 \varepsilon^2}{2b} + \frac{a}{b} \varepsilon v + \frac{a}{2} \varepsilon^2 + \varepsilon v$$

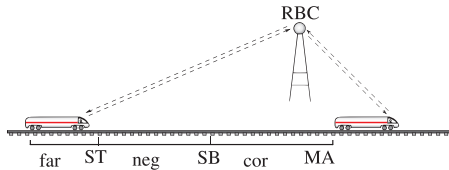
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- Continuous dynamics (differential equations)
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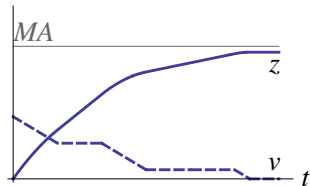


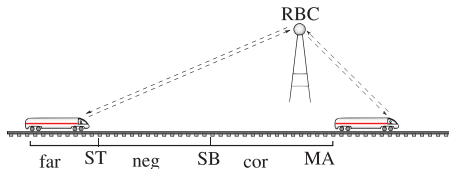
$\forall MA \exists SB$ "train always safe"



Parametric Hybrid Systems

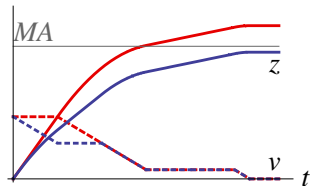
continuous evolution along differential equations + discrete change

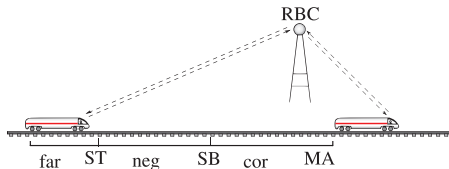




Parametric Hybrid Systems

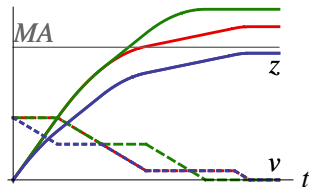
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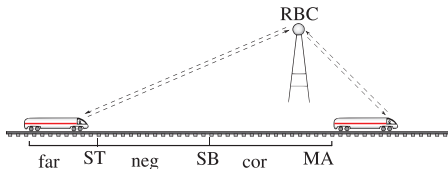




Parametric Hybrid Systems

continuous evolution along differential equations + discrete change



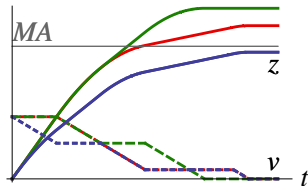


Parametric Hybrid Systems

continuous evolution along differential equations + discrete change

- Challenge: verification
- Which constraints for parameter SB ?

$\forall MA \exists SB$ "train always safe"



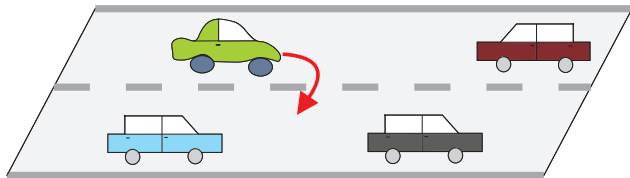


- Train engineer disobeyed stop signal at single track section
- No warning issued to train dispatcher
- First sight 4 seconds before impact
- Freight train triggers emergency brakes 2 seconds before impact



Head-on Train Collision at Chatsworth, CA 2008





- Adaptive cruise control keeps safe distance?
- Lane change assistant
- Safe control with wireless interactions in CAR2CAR and USCAR
- Virtual car platooning

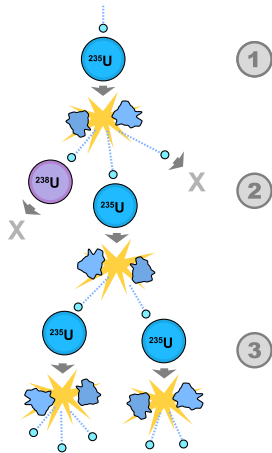
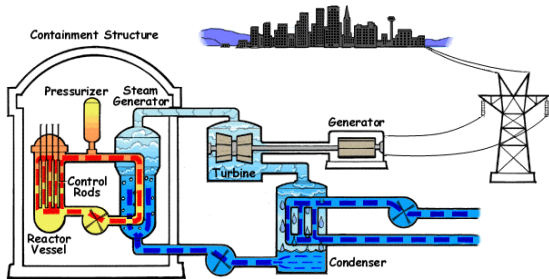


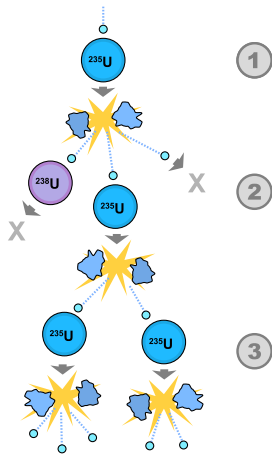
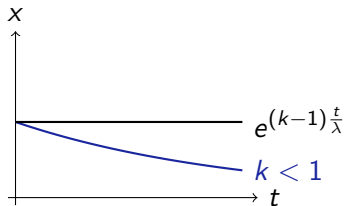


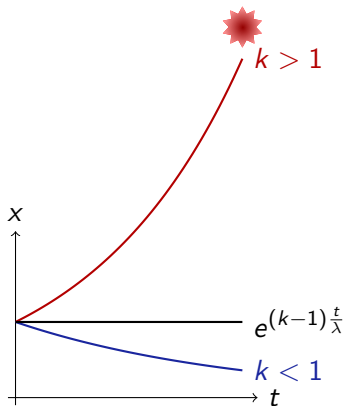
- Safe and stable UAV flight control
- Mixing UAV swarms into pilot flight control areas
- Refueling of UAV: mixed human operation and micro turbulences
- **Many other robotic applications**



Computerized Chemical/Physical Process Control

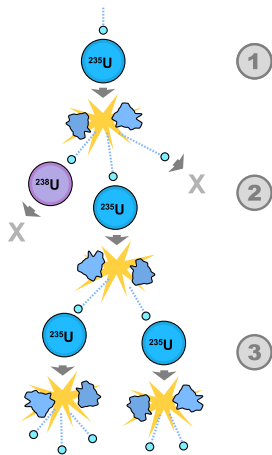


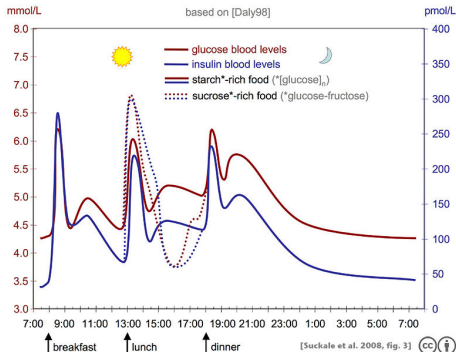




Control objective

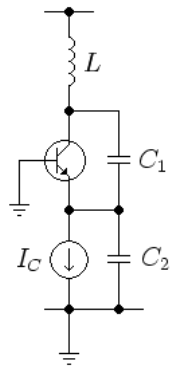
Stabilize neutron multiplication factor





Control objective

Maintain glucose in bounded range





Hybrid Systems Analysis is Important for ...

