

# Exploring Weakly-Hard Paradigm for Networked Systems

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# Background

Timing and Failure

The design of systems that work

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# Hard Real-Time Model



WCET Analysis

Characterize the system.  
How bad can it get, exactly?

*Can I even do this?  
Is it just hard? Or impossible?*

Deadlines

Give each task a deadline.

Scheduling

Plan everything.  
Power, resources, period.

# Firm/Soft Real-Time Model

pWCET\* Analysis

Distributions\*

Scheduling

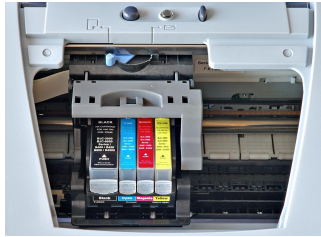
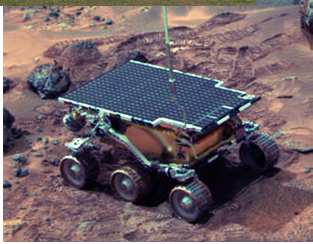
Characterize the system.  
How bad can it get, probably\*?

Assign each task a distribution\*.

Plan everything.  
Power, resources, period.

*Is this useful for my  
application?*

# Timing Constraints vs Guarantees



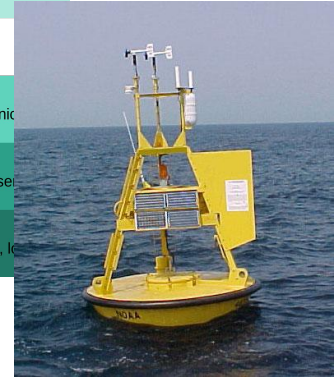
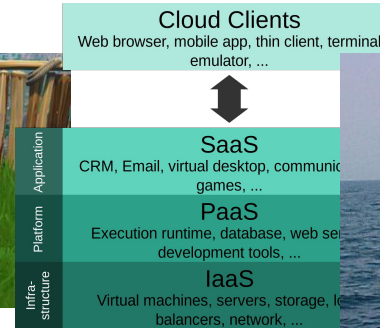
**Hard**



**Firm**



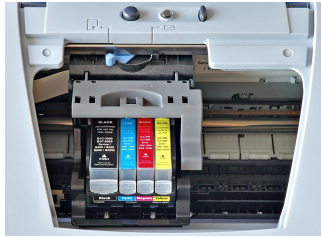
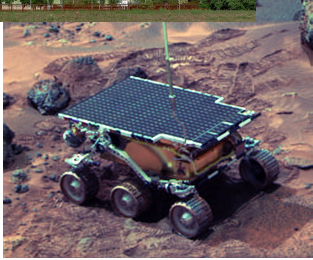
**NETFLIX**



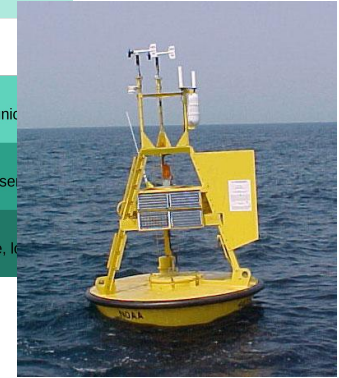
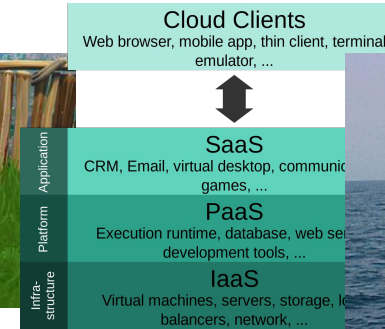
**Soft**



# Timing Constraints vs Guarantees



**Hard**



**Firm**

**NETFLIX**

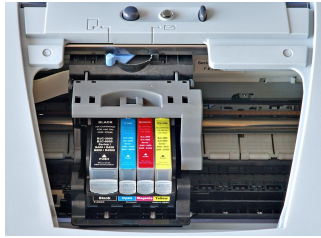
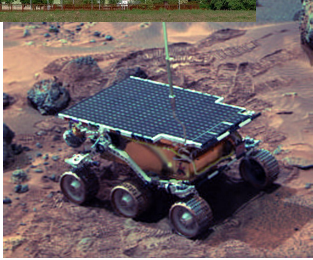
**Soft**

*Trace guarantee*  
(deterministic)

*Set of traces guarantee*  
(probabilistic)



# Timing Constraints vs Guarantees



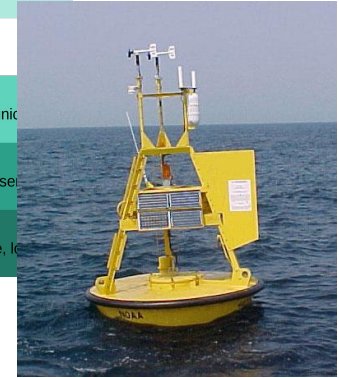
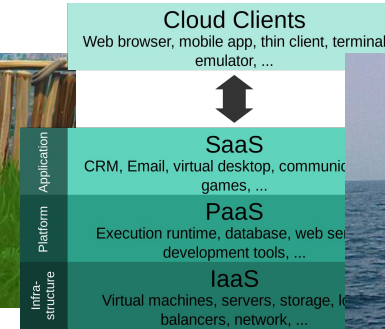
**Hard**



**Firm**



**NETFLIX**



**Soft**

*Trace guarantee*  
(deterministic)

*Trace guarantee*  
(deterministic)

*Set of traces guarantee*  
(probabilistic)

Can I get trace guarantees if  
computing WCETs is hard?

How about introducing  
*bounded non-determinism*?



		Meet	Consecutive	Meaning
1	$\langle m, K \rangle$	✓	✗	Meet at least $m$ deadlines of every $K$
2	$\langle\langle m, K \rangle\rangle$	✓	✓	Meet at least $m$ consecutive deadlines in every $K$
3	$(m, K)$	✗	✗	Miss no more than $m$ deadlines of every $K$
4	$((m, K))$	✗	✓	Miss no more than $m$ consecutive deadlines in every $K$

		Meet	Consecutive	Meaning
1	$\langle m, K \rangle$	✓	✗	Meet at least $m$ deadlines of every $K$
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3	$(m, K)$	✗	✗	Miss no more than $m$ deadlines of every $K$
4	$((m, K))$	✗	✓	Miss no more than $m$ consecutive deadlines in every $K$

# Weakly-Hard Real-Time Model

“Analysis”

Characterize the system.  
pWCET or  $(m, K)$ -type  
constraints.

*Easier than analysis during  
design of a Hard Real-Time  
System.*

“Deadlines”

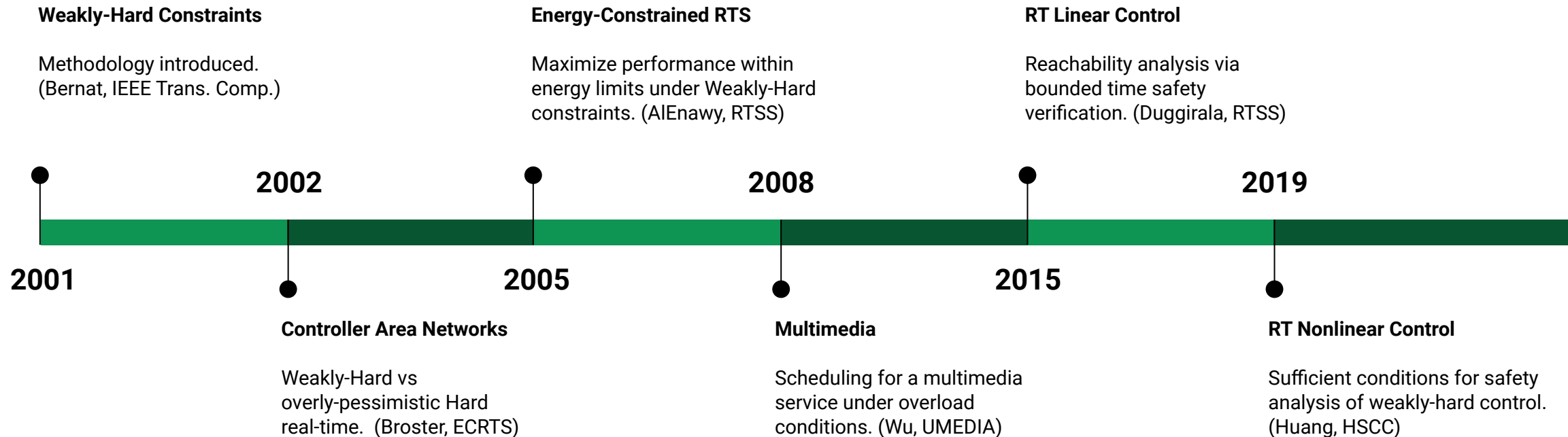
Give each task a deadline.  
Deadline misses are bounded.

Scheduling

Plan everything.  
Power, resources, period.

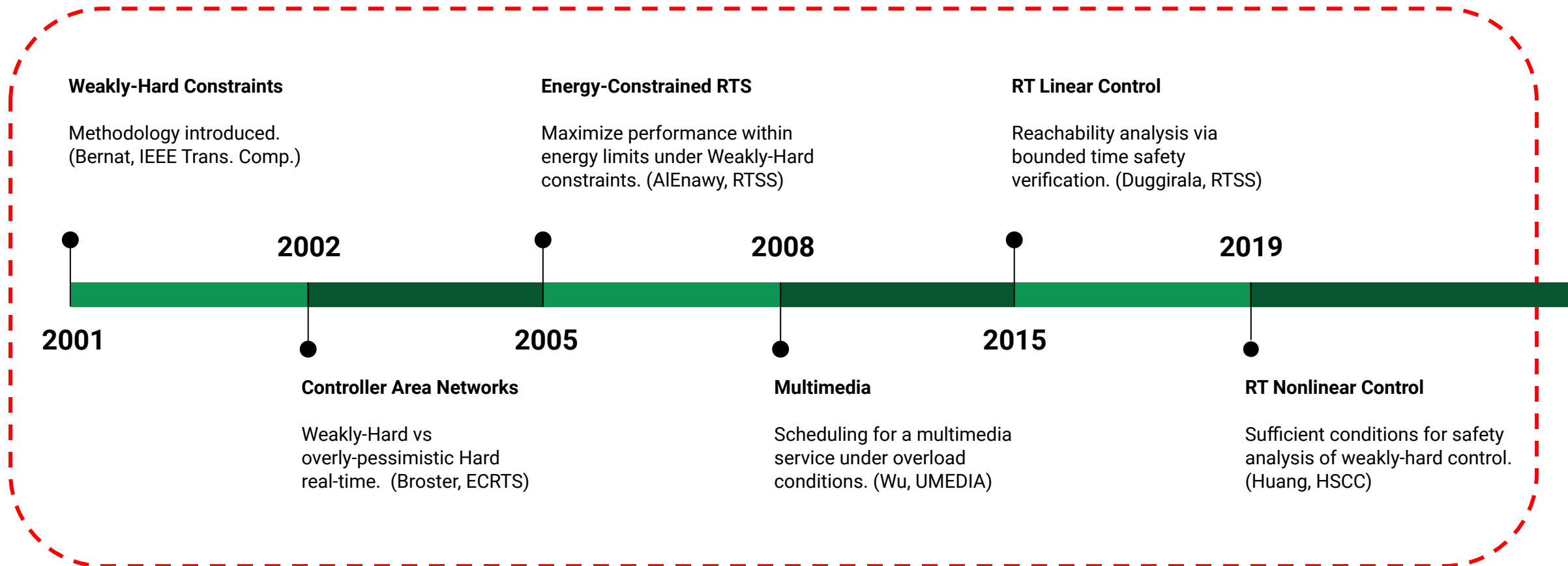
*Traded probabilities for  
bounded non-determinism.  
**Potentially higher  
performance! Still get trace  
guarantees!***

# Applications of the Weakly-Hard Model



# Applications of the Weakly-Hard Model

## *Embedded Systems*

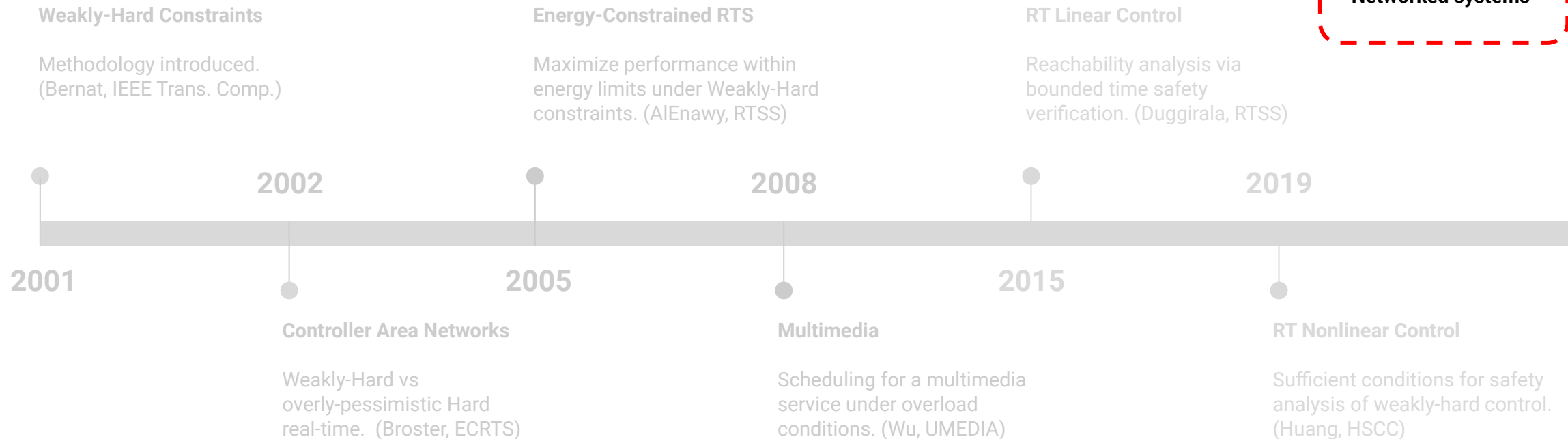


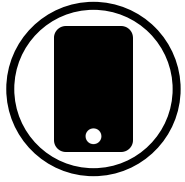
# Applications of the Weakly-Hard Model

*Not an  
Embedded  
System*

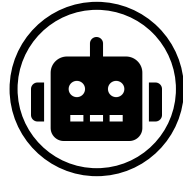
20??

**Networked systems**





Mobile Cloud



Cloud Robotics



Connected Vehicles



IoT

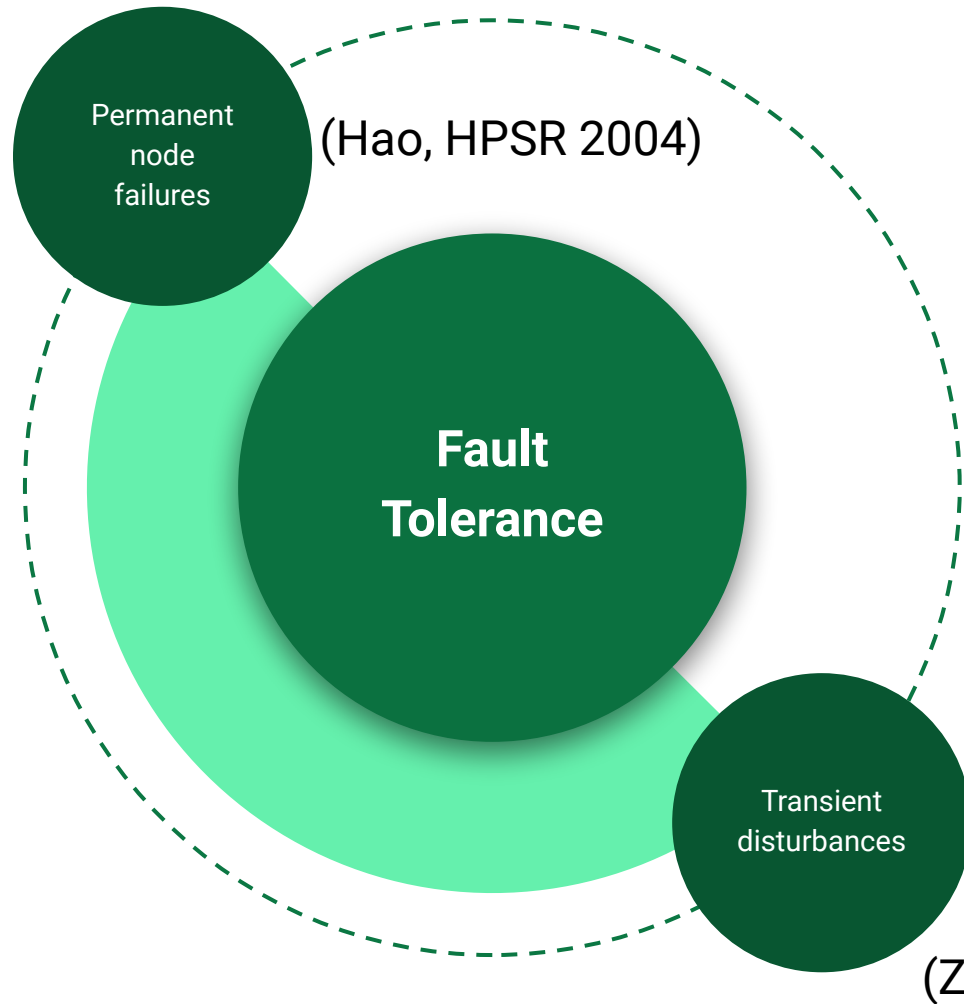
QoS   Control   Consensus   Reliability

Flooding   Reachability   Stability

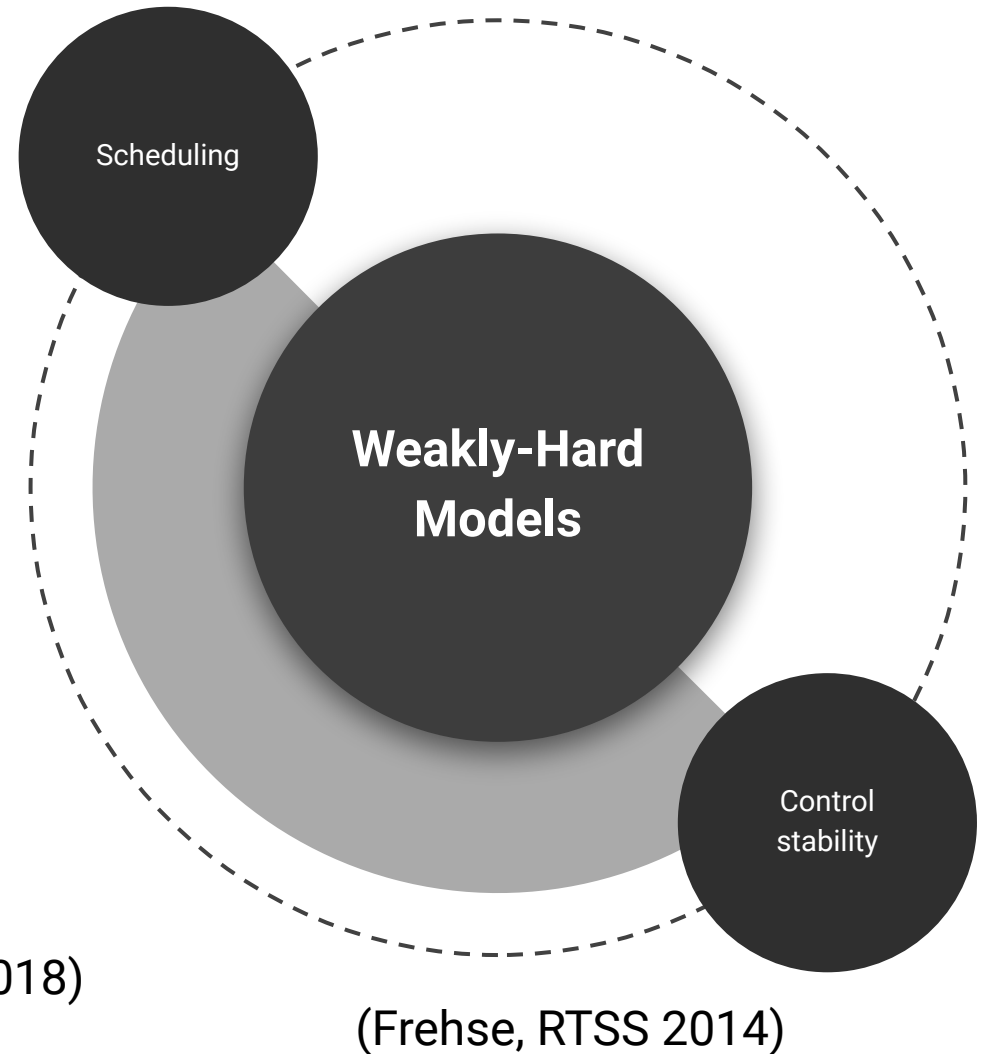


WCET-based analysis of  
networked systems is likely  
impossible.

# Related Work

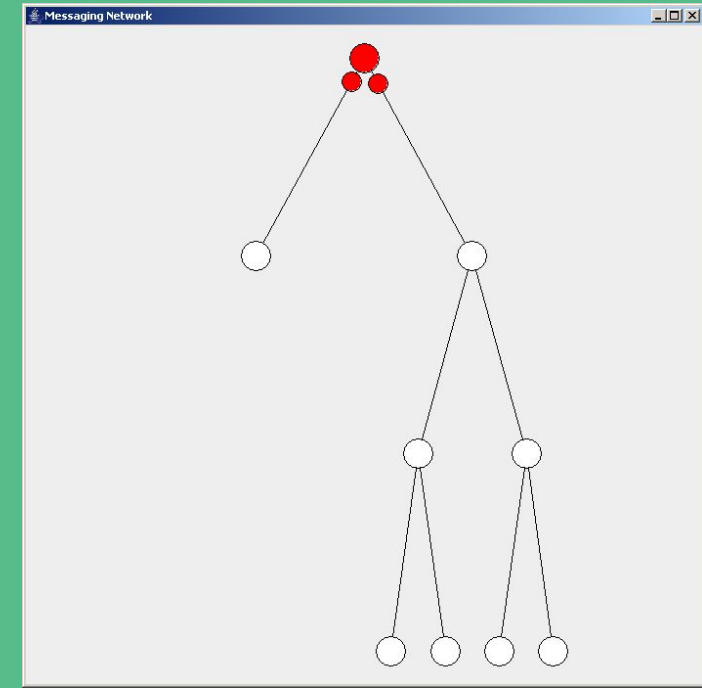


(Ahrendts, ECRTS 2018)



# Network Flooding

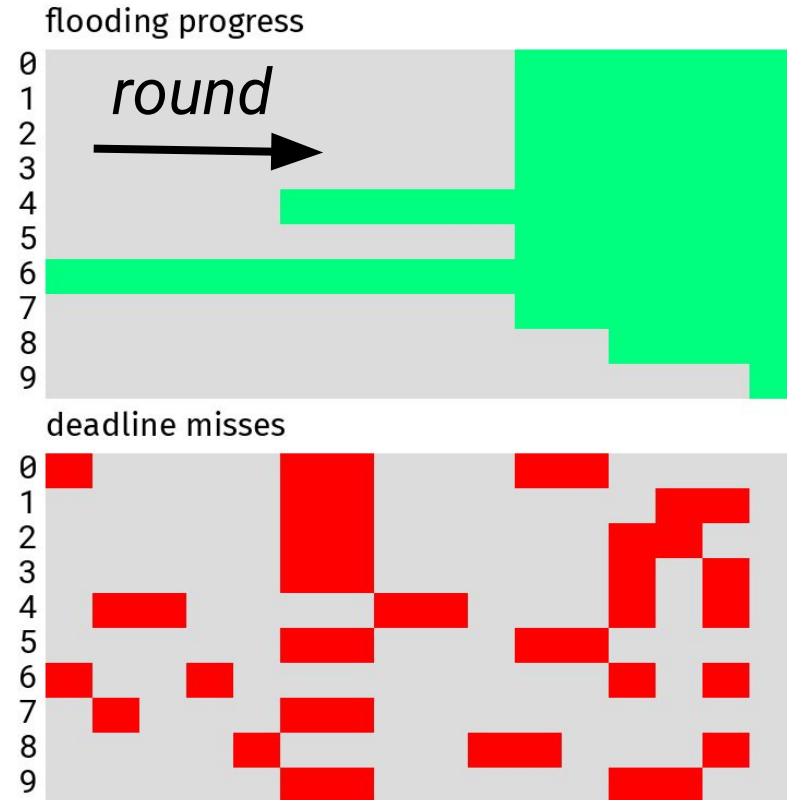
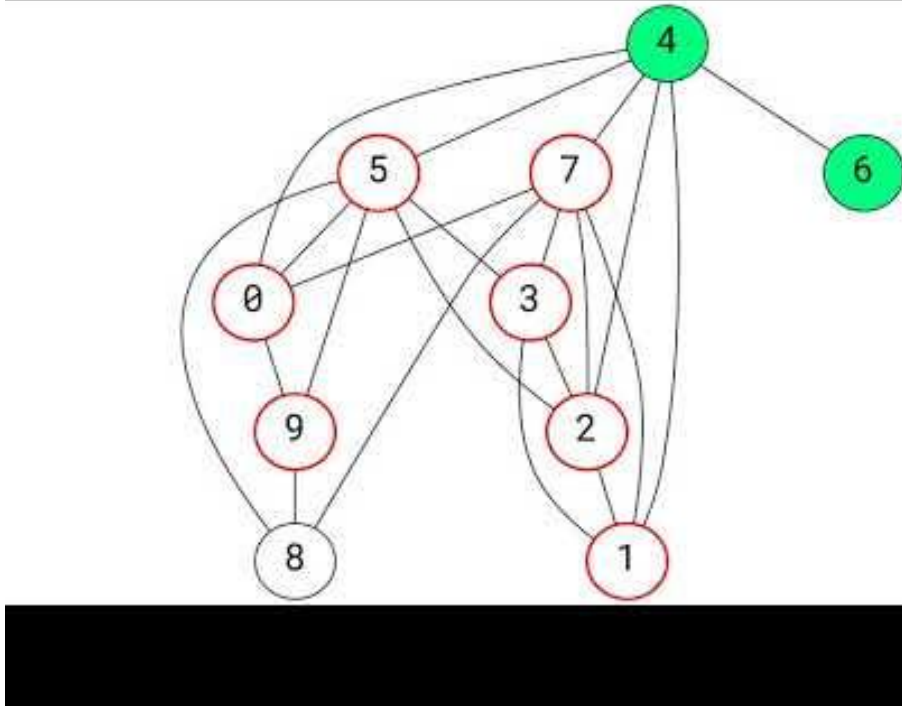
Capturing Node or Link Failures



Florian Lindner

Glossy Low-Power Wireless Bus  
(Ferrari, IPSN'11)

\_\_\_\_\_



The flood is initialized by node #6

**Flooding  
Specification**

INIT, FLOOD

+

**Synchronous  
Updates**

EVOLVE, PERSIST

+

**Weakly-Hard  
Constraints**

$(m, K)$  on every  
node

**Throw it to the SMT solver**

and iterate over the finite horizon

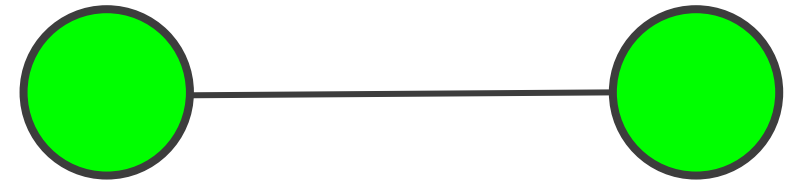
# Example: the EVOLVE Constraint



Node  $i$

Node  $j$

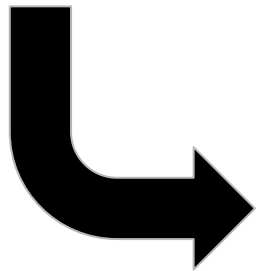
Time  $t$ ,  $i$  and  $j$  on,  $j$  has the packet



Node  $i$

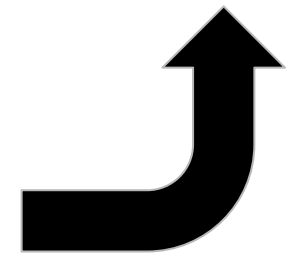
Node  $j$

Time  $t+1$ ,  $i$  and  $j$  on,  $i$  and  $j$  have the packet

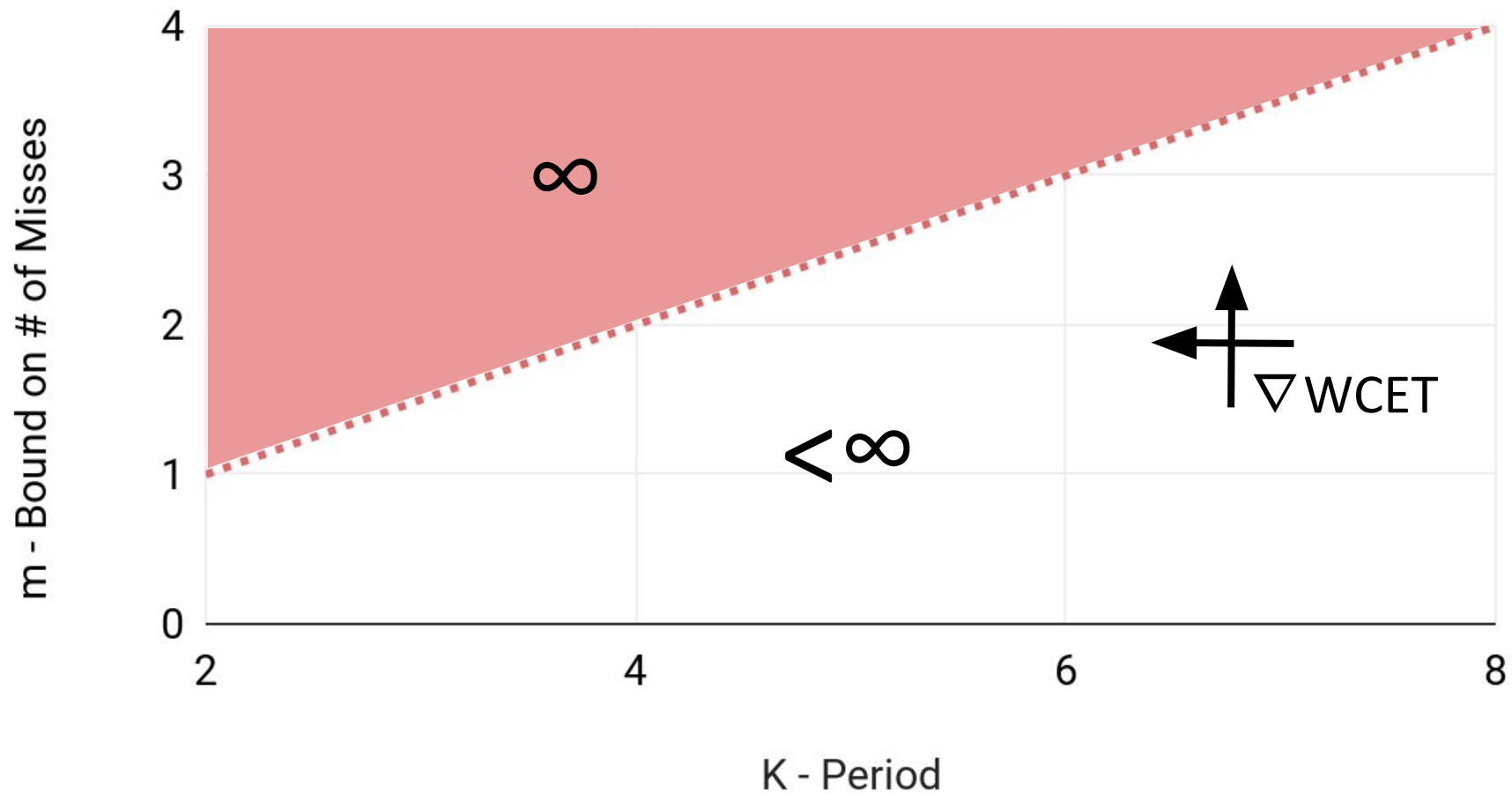


$$\bigwedge_{i,j} \bigwedge_{t < T-1} p_{i,t} \wedge \neg m_{i,t} \wedge \neg m_{j,t} \wedge a_{i,j} \rightarrow p_{j,t+1}$$

The EVOLVE constraint



## Worst-Case Latency vs ( $m$ , $K$ )



Worst-case latency increases as either  $m$  increases or  $K$  decreases



**Table 1: Average increase in maximum latency under various  $(m, K)$  constraints relative to  $D_G$ .**

		$K$						
		3	4	5	6	7	8	9
m	1	2.59x	2.59x	2.00x	2.00x	2.00x	2.00x	2.00x
	2	-	-	4.17x	4.17x	4.17x	3.00x	3.00x
	3	-	-	-	-	5.76x	5.76x	5.76x
	4	-	-	-	-	-	-	7.35x

The fraction of  $m$  over  $K$  is not what drives high worst-case latency (consecutive misses do).

# Richer Design Choices with Weakly-Hard

Under a hard timing model



Under a weakly-hard timing model



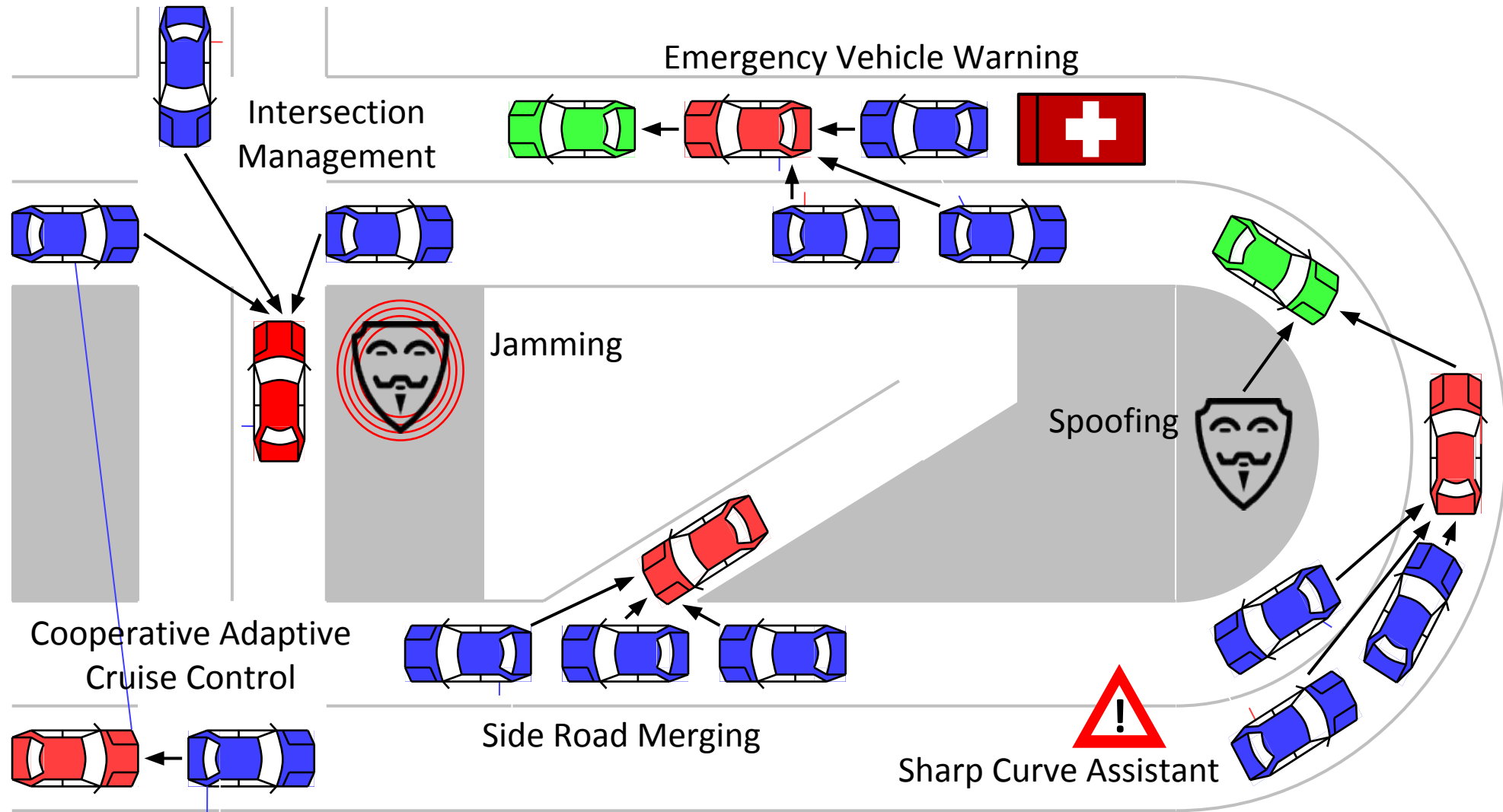
Allowing bounded misses can enable shorter periods, potentially enabling faster runtimes and better performance

# V2V Networks

à la VANET

Beyond single-vehicle  
autonomous driving

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# Communication Disturbance in V2V

## Packet Delay & Loss

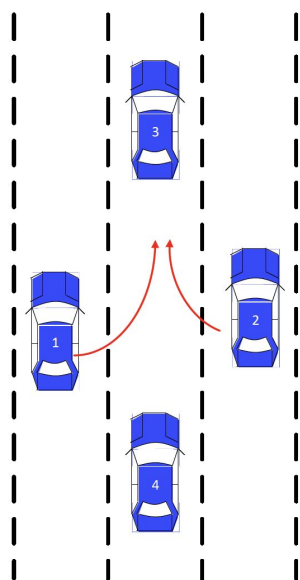
- Communication delay
- Packet collision/loss
- Jamming/flooding attacks

## Prior Work

- Doesn't consider packet loss
- Deadlock & unsafe situations
- Liveness issues

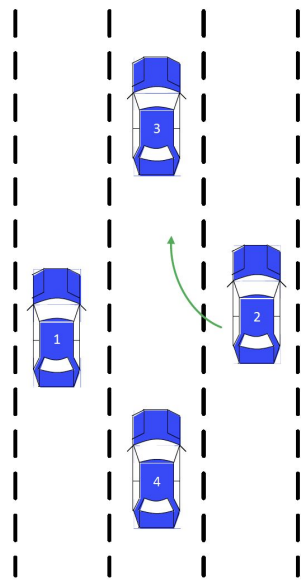
*How should one measure the impact of disturbances? How should one derive the communication requirements?*

# Cooperative Lane Changing Under Disturbance



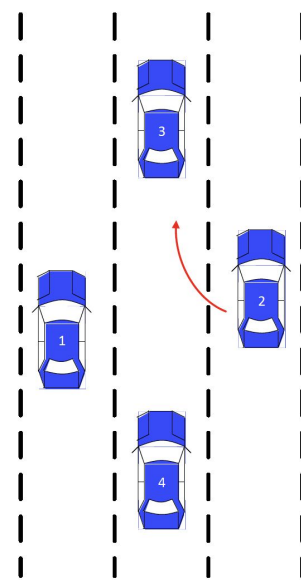
Vehicle	Agreement
1	1 merge
2	2 merge
3	2 merge
4	1 merge

a. unsafe scenario under partial agreement



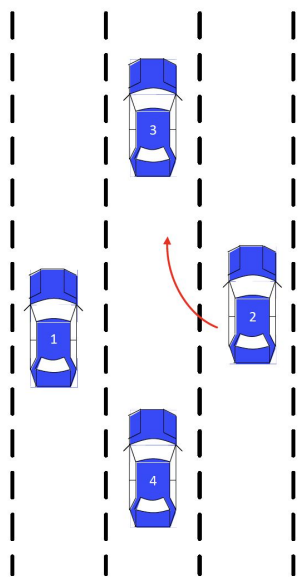
Vehicle	Agreement
1	2 merge
2	2 merge
3	2 merge
4	2 merge

b. safe scenario under global agreement (consensus)



Vehicle	Agreement
1	2 merge
2	2 merge
3	1 merge
4	2 merge

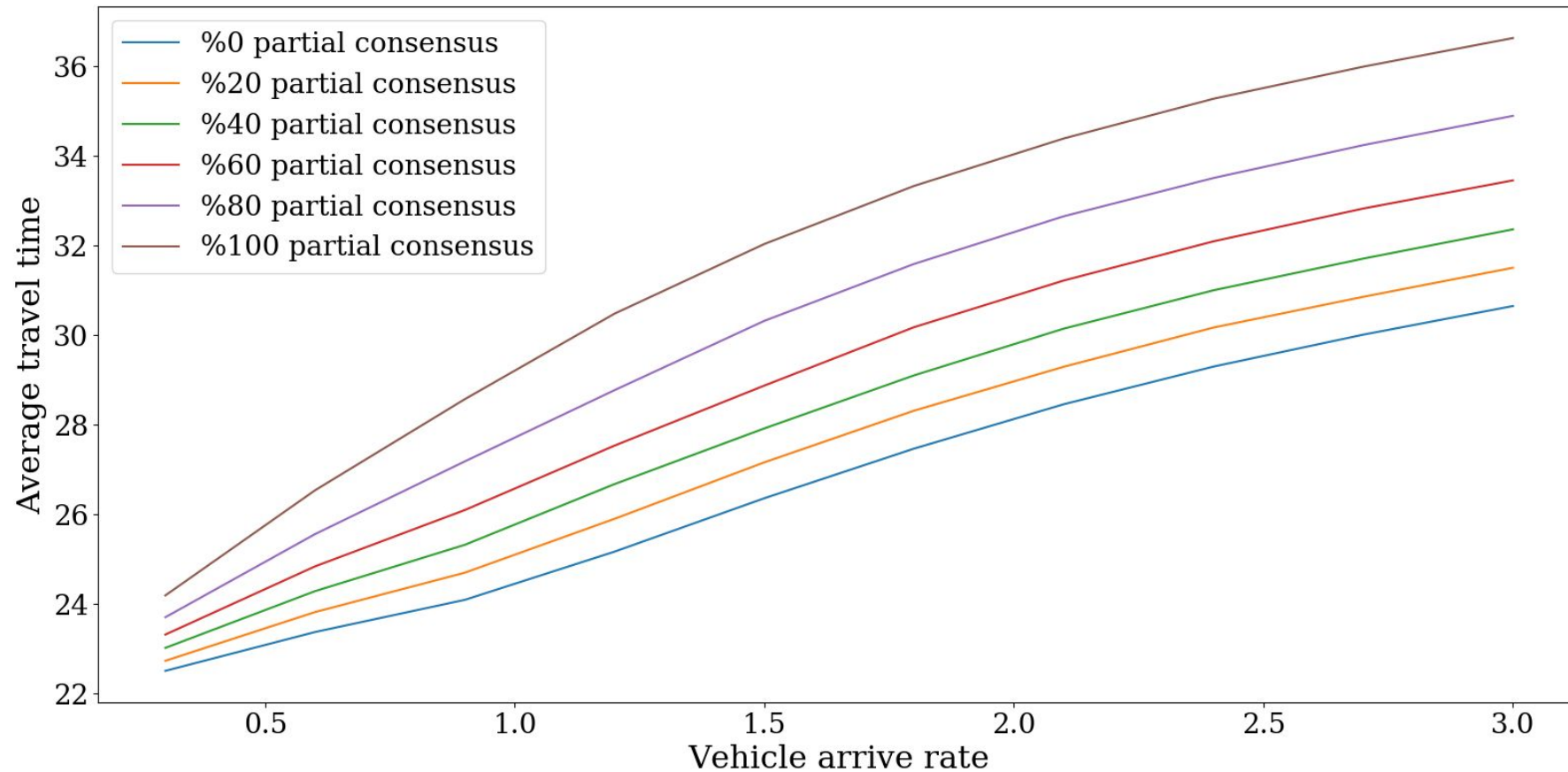
c. less safe than (b) but safer than (a)



Vehicle	Agreement
1	2 merge
2	2 merge
3	1 merge
4	1 merge

d. less safe than (c) but safer than (a)

# Impact of Disturbances on Lane Changing



Performance degrades as disturbances cause increasing rates of partial consensus.



A Weakly-Hard Model of V2V  
disturbances allows us to  
directly reason about safety  
and performance

# Research Directions

Networked Systems through the  
lens of Weakly-Hard Models

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# Stabilization

Given any, even faulty, initial state, the system should reach a correct state.

# Reachability

Packets of a given class should only reach the designated host.

# Consensus

Leader selection in the presence of faulty nodes or links.

# Reliability

Correctness should be tolerant to occasional link failures.

# QoS

Bounded latency in packet routing.

Thanks!

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