



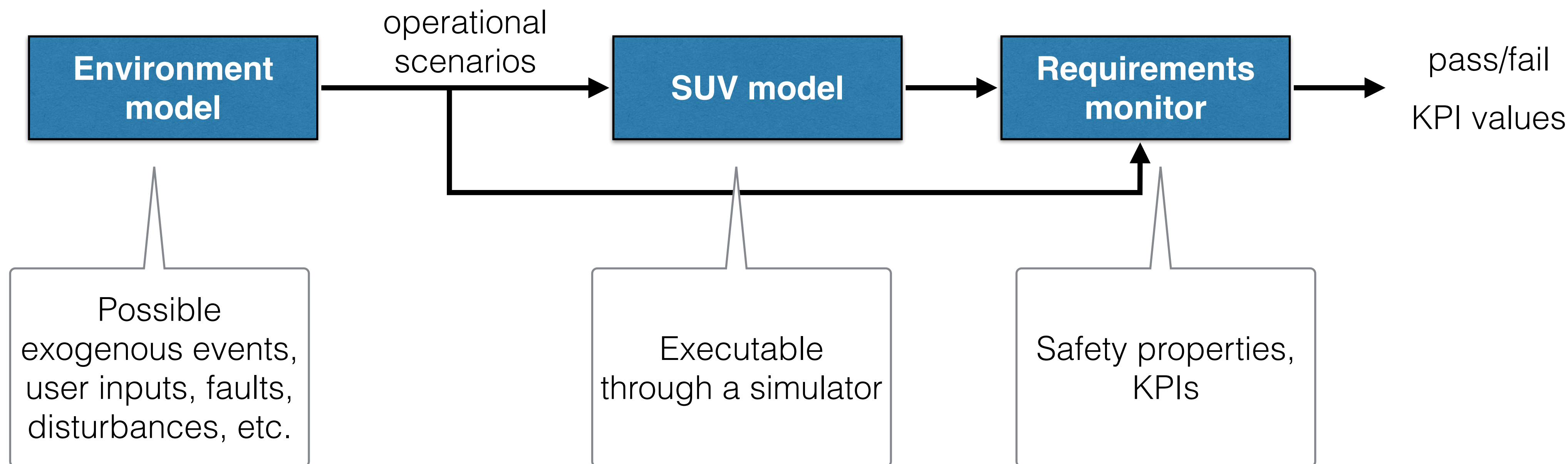
# Automatic Generation of Simulation Scenarios for Statistical Model Checking of Real-Time Systems [\*]

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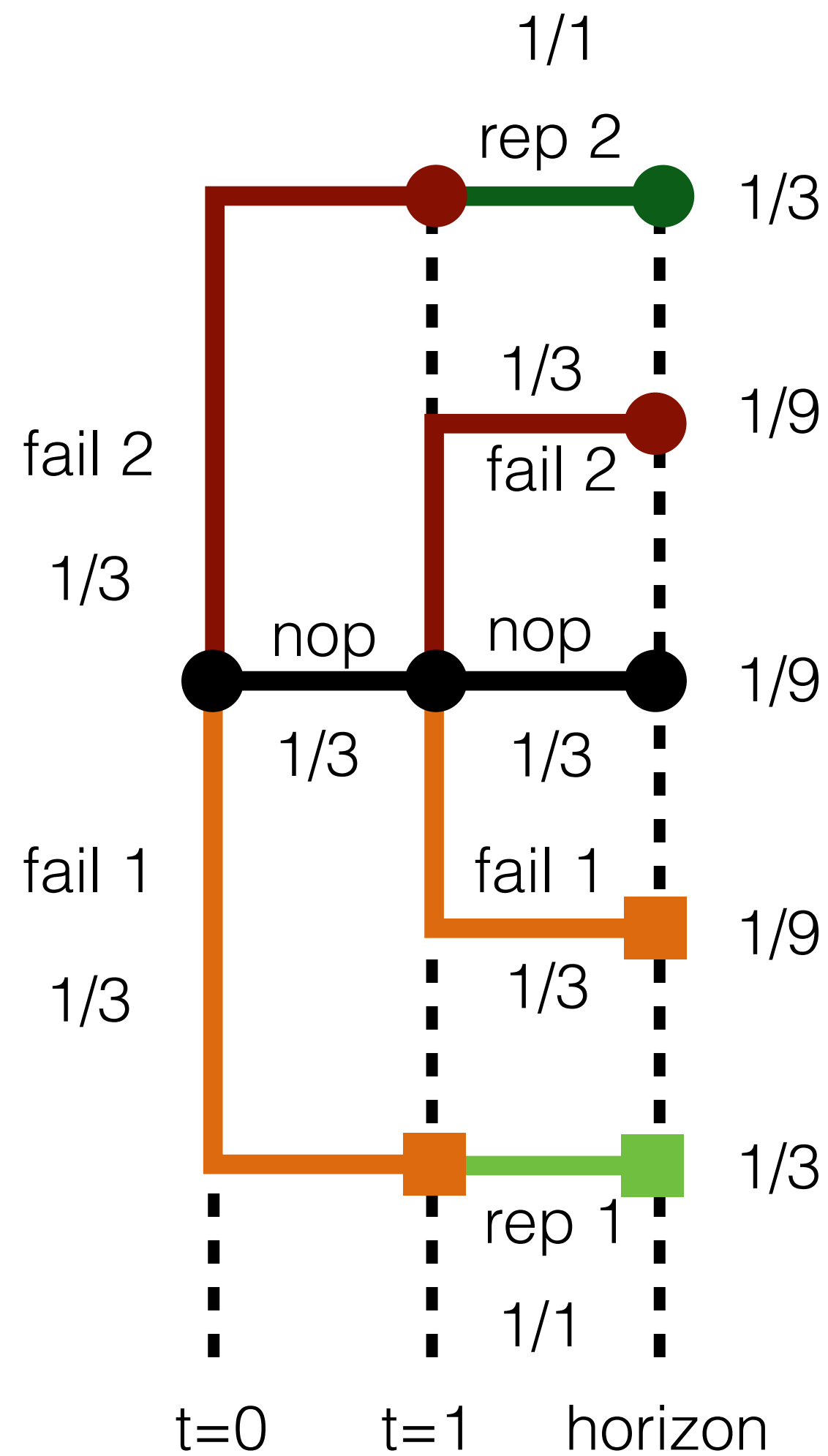
[\*] Toni Mancini, Igor Melatti, Enrico Tronci.

Any-horizon Uniform Random Sampling and Enumeration of Constrained Scenarios for Simulation-based Formal Verification.  
IEEE Transactions on Software Engineering, 2021. DOI: 10.1109/TSE.2021.3109842

# Simulation-based verification



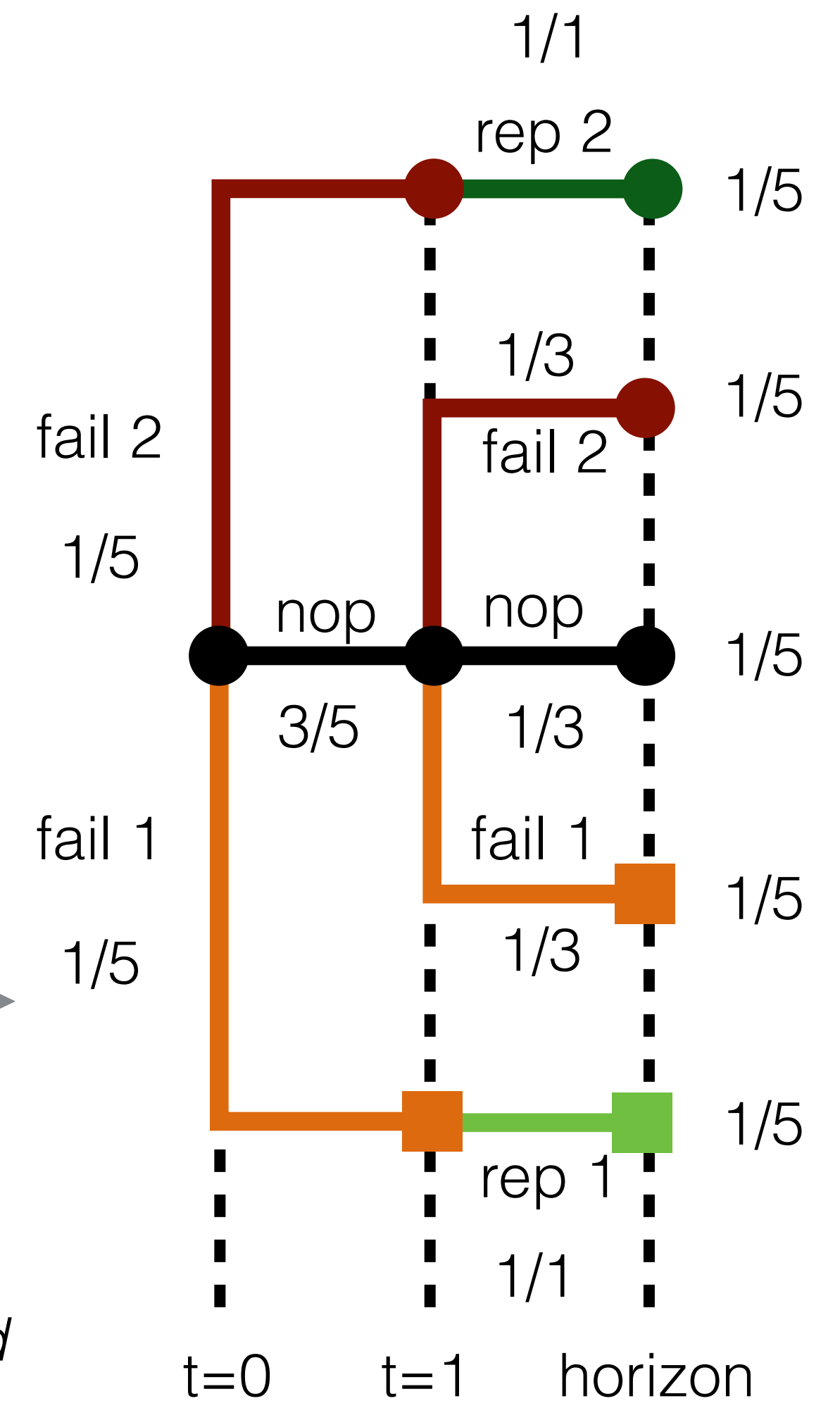
# Sampling events vs. sampling scenarios



**Uniform sampling of scenarios** yields minimum worst-case expected verification time [1].  
**Not easy to obtain.**

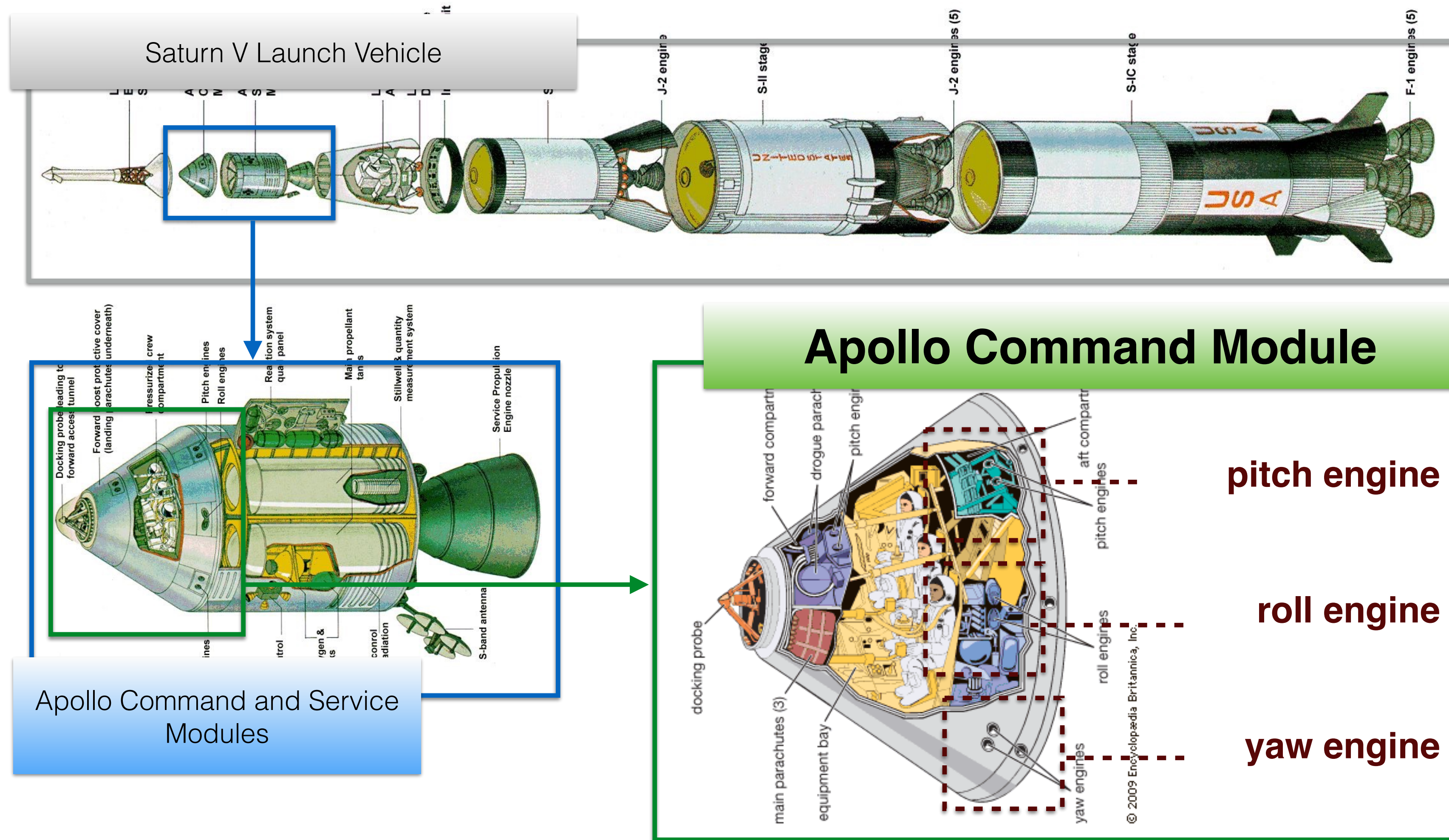
Uniform sampling of admissible events **does not** yield a uniform sampling of admissible scenarios

Uniform sampling of scenarios requires **suitable probabilities** for occurrences of events **at each node**



[1] T. Mancini, et al. *On minimising the maximum expected verification time*. Information Processing Letters 122, 2017

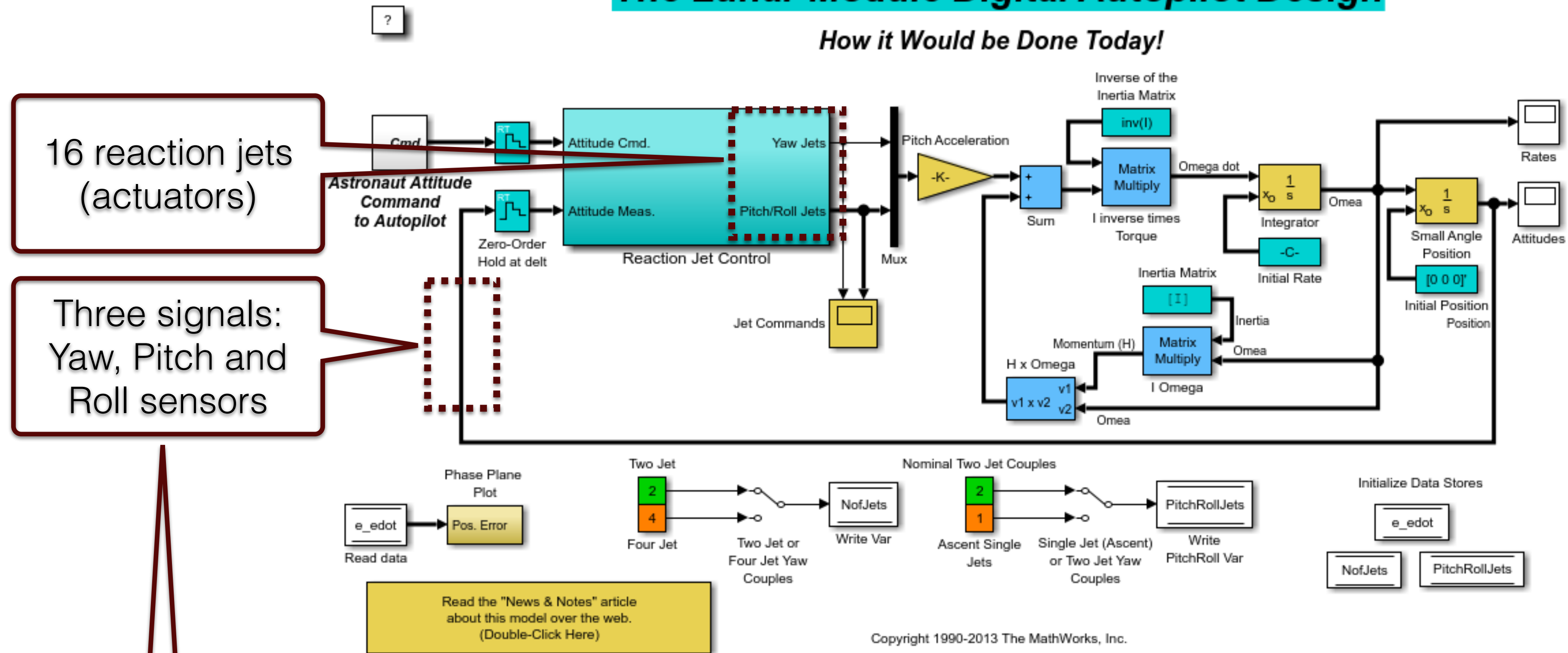
# Example: Apollo Lunar Module Autopilot (ALMA)



# Example: ALMA Simulink model

## The Lunar Module Digital Autopilot Design

How it Would be Done Today!



**Safety: Yaw, Pitch and Roll close to 0**



# SUV environment: ALMA

## Events

- **Inputs from autopilot:**

- Time series of module attitude change requests (Yaw, Pitch, Roll)

- **Faults and disturbances**

- Additive errors on attitude sensors (current orientation: Yaw, Pitch, Roll)
- Temporary faults on reaction jets (actuators)

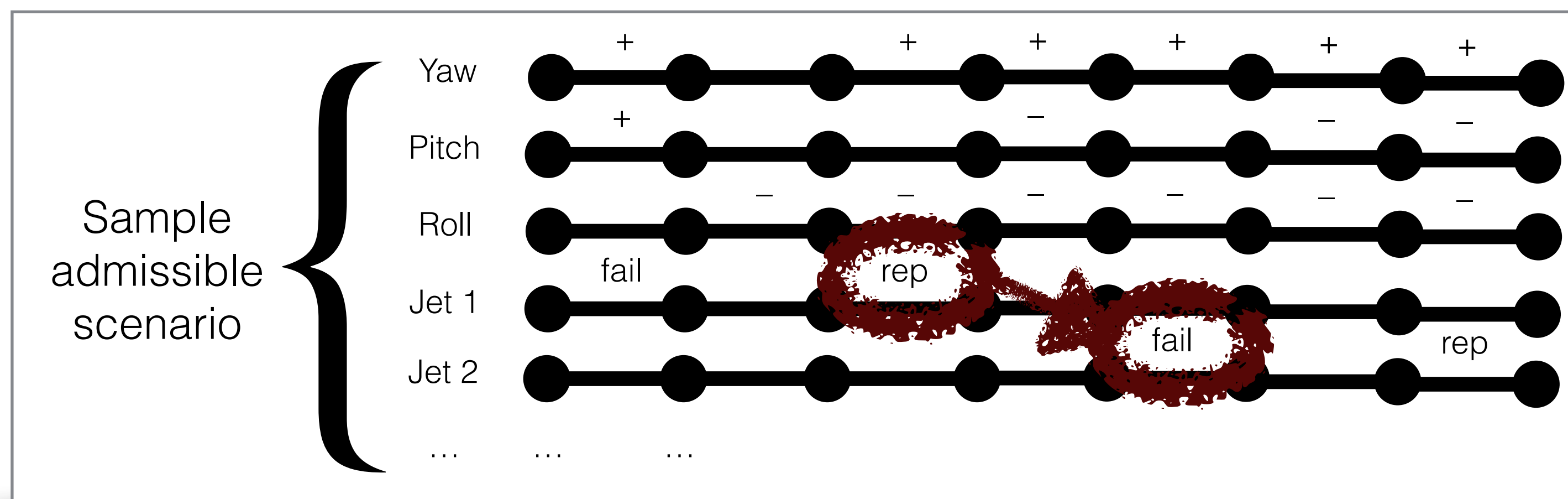
## Requirements

- **Assumptions**

- No immediate undo of attitude change requests
- Noise signals chosen from portfolio and changing during time
- Jets recovery from faults with 2-3 time units

- **Additional requirements to focus verification**

- No multiple jets faulty at the same time



# Our approach [1]

## 1. Requirements on environment events via composable finite states machines (monitors)

- Defined through user-friendly Python- or Modelica-based languages

## 2. Scenario generators automatically computed, offering API to return:

- number of admissible scenarios of given length  $h$  (horizon)
- the  $i$ -th lex-ordered admissible scenario of length  $h$

## The above seamlessly supports all sorts of verification activities:

- statistical model checking (via **uniform** random sampling of admissible scenarios)
- exhaustive (possibly **uniformly randomised**) verification, **minimising worst-case expected verification time** [2]

[1] T. Mancini *et al.* *Any-horizon Uniform Random Sampling and Enumeration of Constrained Scenarios for Simulation-based Formal Verification*. IEEE Transactions on Software Engineering, 2021. DOI: 10.1109/TSE.2021.3109842

[2] T. Mancini, *et al.* *On minimising the maximum expected verification time*. Information Processing Letters 122, 2017

# Experimental results: computation of scenario generators

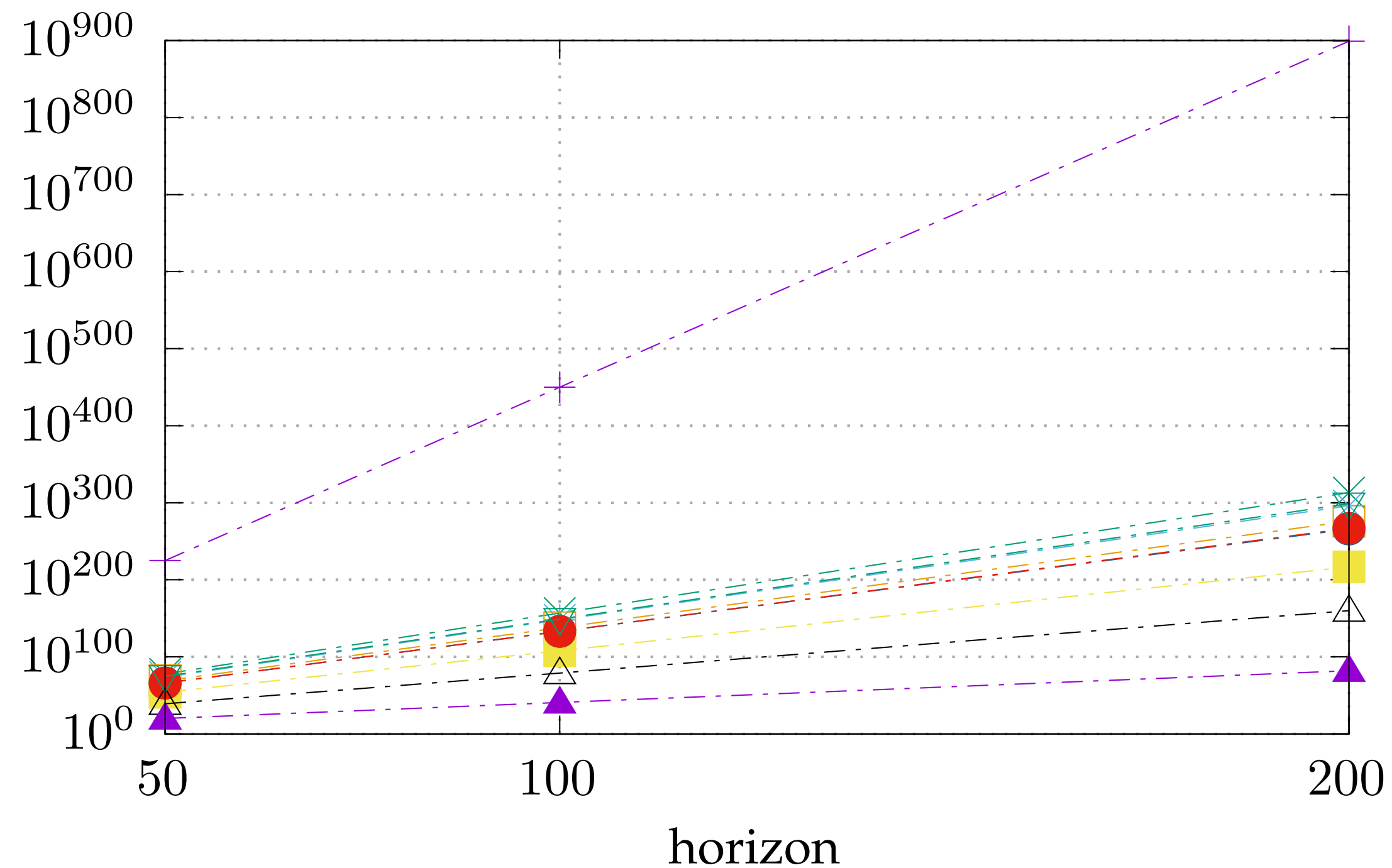
SUV	SG nb.	$\mathcal{M}$			$Gen(\mathcal{M})$
		assumptions monitor	constraint monitors	size of input space	time [s]
Apollo Lunar Module Autopilot	1	$\mathcal{A}_{rj}$	–	1 769 472	0.44
	2	$\mathcal{A}_{rj}$	1	108	0.44
	3	$\mathcal{A}_{rj}$	1, 2	108	448.88
	4	$\mathcal{A}_{rj}$	1, 2, 3	108	247.27
	5	$\mathcal{A}_{rj}$	1, 2, 3, 4	108	55.19
	6	$\mathcal{A}_{rj}$	1, 2, 3, 5	108	188.3
	7	$\mathcal{A}_s$	–	27	2.94
	8	$\mathcal{A}_s$	6	27	1.33
	9	$\mathcal{A}_s$	6, 7	27	782.2
	10	$\mathcal{A}_{ALMA}$	1, 2, 3, 4, 6, 7	2916	837.39

SUV	SG nb.	$\mathcal{M}$			$Gen(\mathcal{M})$
		assumptions monitor	constraint monitors	size of input space	time [s]
Buck DC/DC Converter	1	$\mathcal{A}_i$	–	5	0.19
	2	$\mathcal{A}_R$	–	5	0.17
	3	$\mathcal{A}_i \bowtie \mathcal{A}_R$	–	25	0.36
	4	$\mathcal{A}_i$	1	5	0.12
	5	$\mathcal{A}_i$	2	5	0.17
	6	$\mathcal{A}_R$	3	5	0.11
	7	$\mathcal{A}_R$	4	5	0.16
	8	$\mathcal{A}_i \bowtie \mathcal{A}_R$	5	25	37.34
	9	$\mathcal{A}_i \bowtie \mathcal{A}_R$	2, 4, 5	25	29.68
	10	$\mathcal{A}_i \bowtie \mathcal{A}_R$	2, 4, 5, 6	25	1.94
	11	$\mathcal{A}_i \bowtie \mathcal{A}_R$	1, 3, 5, 7	25	2.16

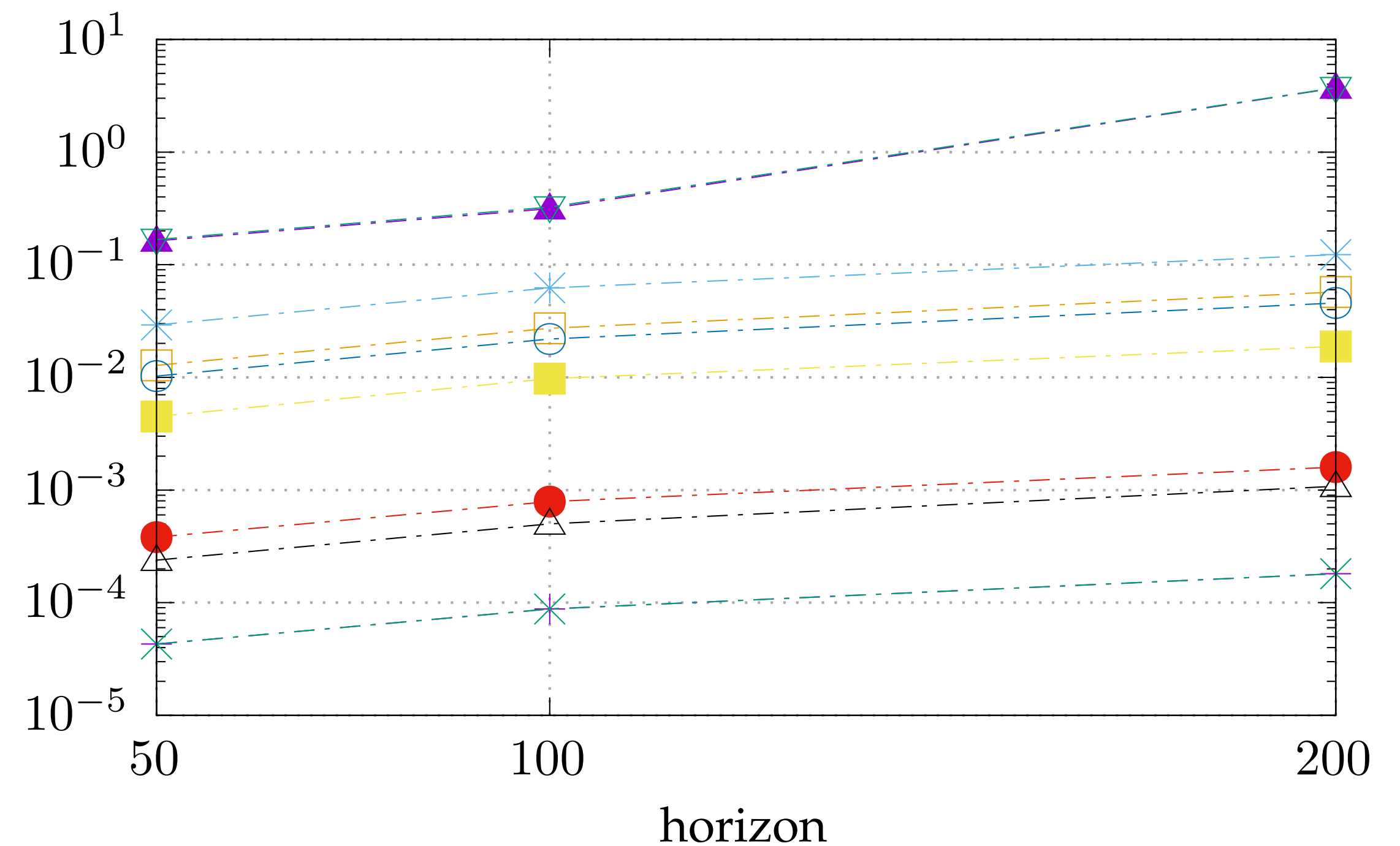
SUV	SG nb.	$\mathcal{M}$			$Gen(\mathcal{M})$
		assumptions monitor	constraint monitors	size of input space	time [s]
Fault-Tolerant Fuel Control System	1	$\mathcal{A}_{FCS}$	–	6	0.1
	2	$\mathcal{A}_{FCS}$	1	6	7.99
	3	$\mathcal{A}_{FCS}$	1, 3	6	4.92
	4	$\mathcal{A}_{FCS}$	1, 2	6	4.61
	5	$\mathcal{A}_{FCS}$	1, 4	6	6.34
	6	$\mathcal{A}_{FCS}$	1, 4, 5	6	5.92
	7	$\mathcal{A}_{FCS}$	1, 4, 6	6	6.55



# Experimental results: scenario extraction



Number of traces



Trace extraction time [s]

## Apollo Lunar Module Autopilot



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# Thank you

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