



# Analyzing Fault Behaviors in Multi-Domain Systems with Contract-Based Monitors

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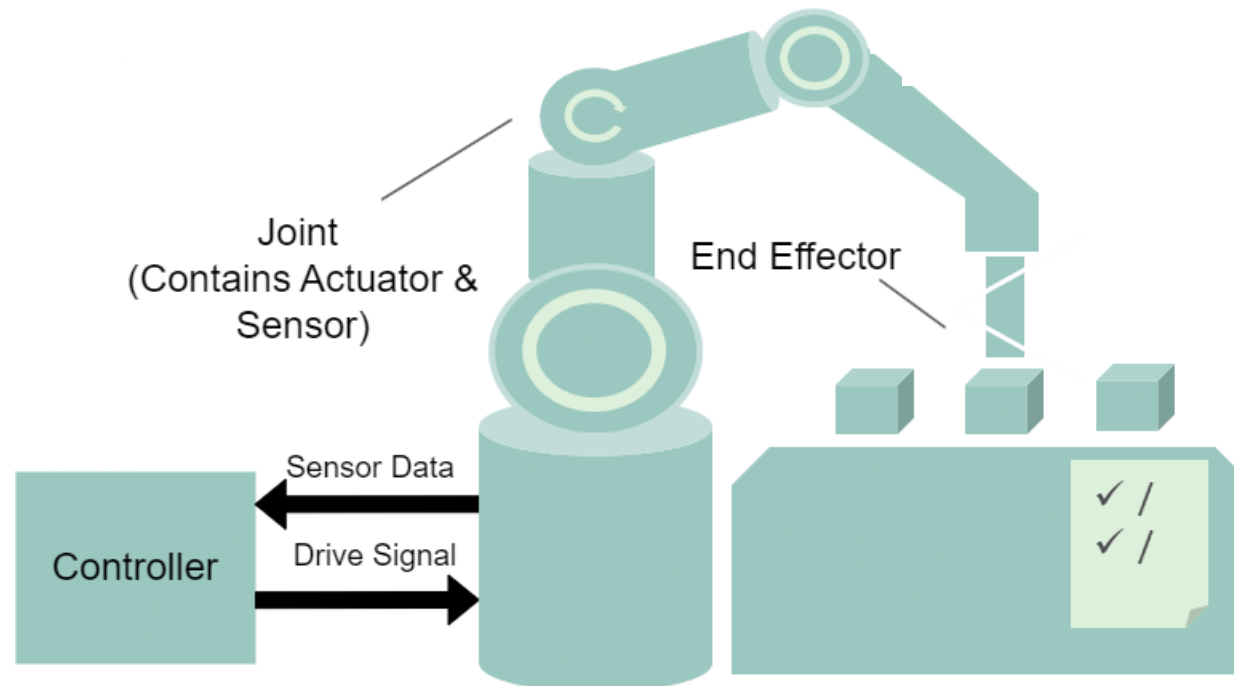
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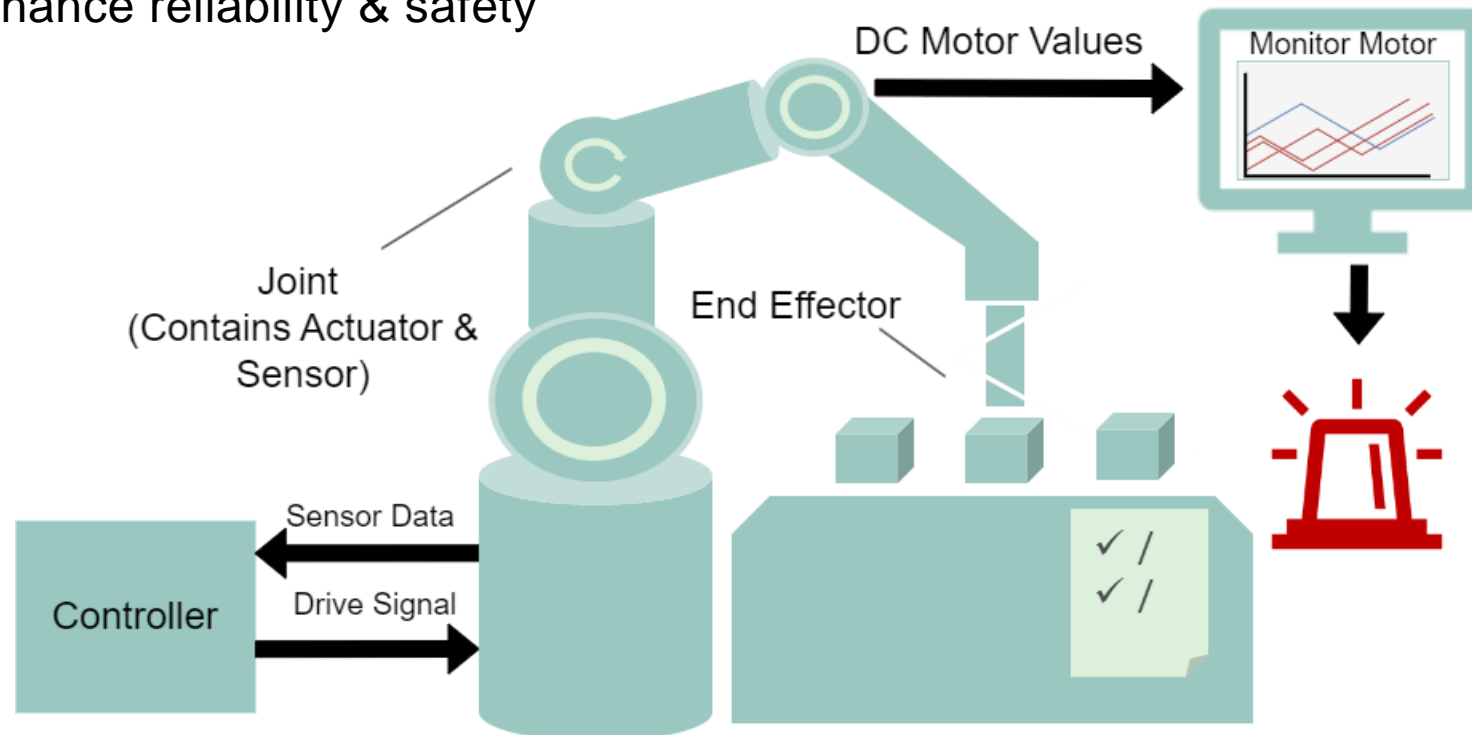
## Motivation

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  - Fault Detection and Isolation (FDI) processes to avoid severe damage
  - Enhance reliability & safety





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  - Map **FDI rules based on threshold verification** on contracts that can be evaluated in a co-simulation environment
  - A simulation-based **fault injection** procedure highlighting the principles of contract-based FDI rules
  - A **simulation of hardware monitors** based on time-sensitive behavioral contracts to detect faults, validating the applicability for use during system operation

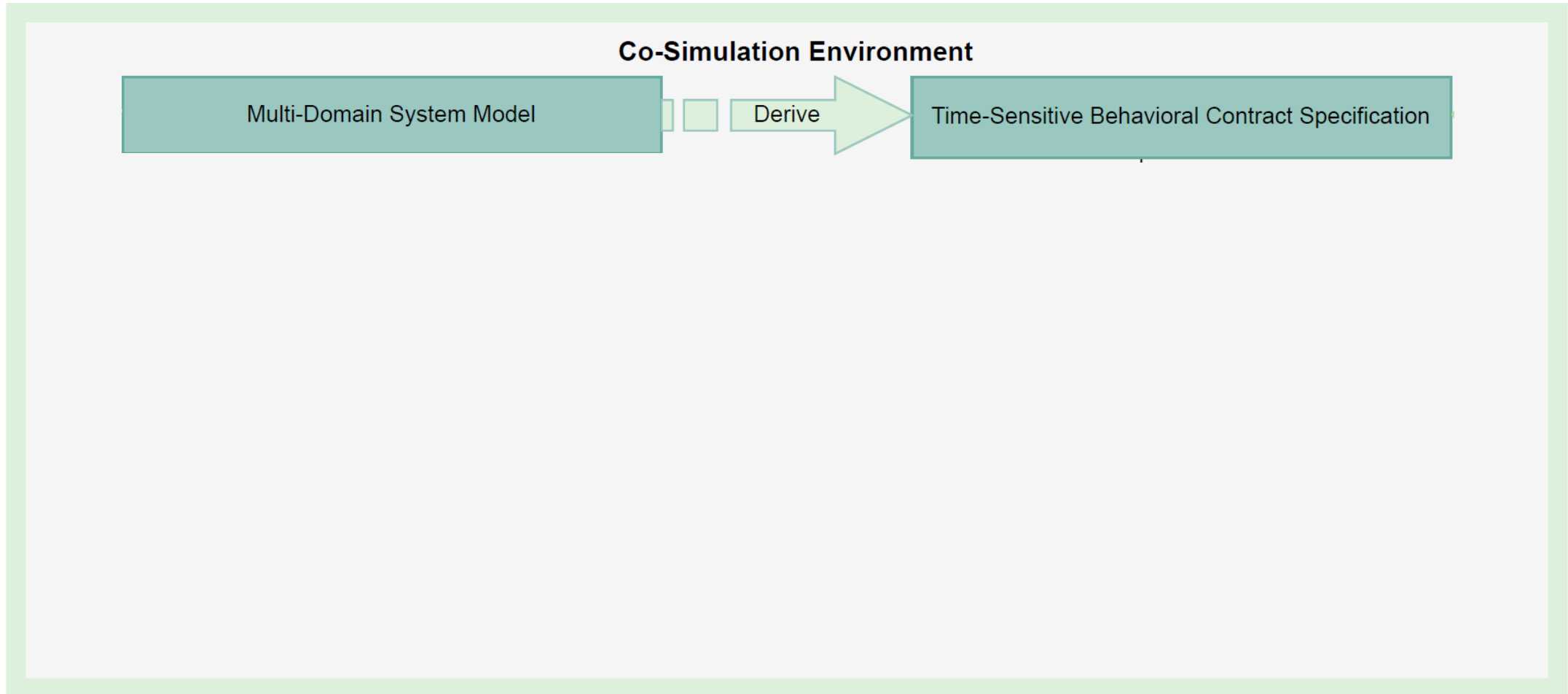


# Enhancing Multi-Fault Detection with Contract-Based Co-Simulation

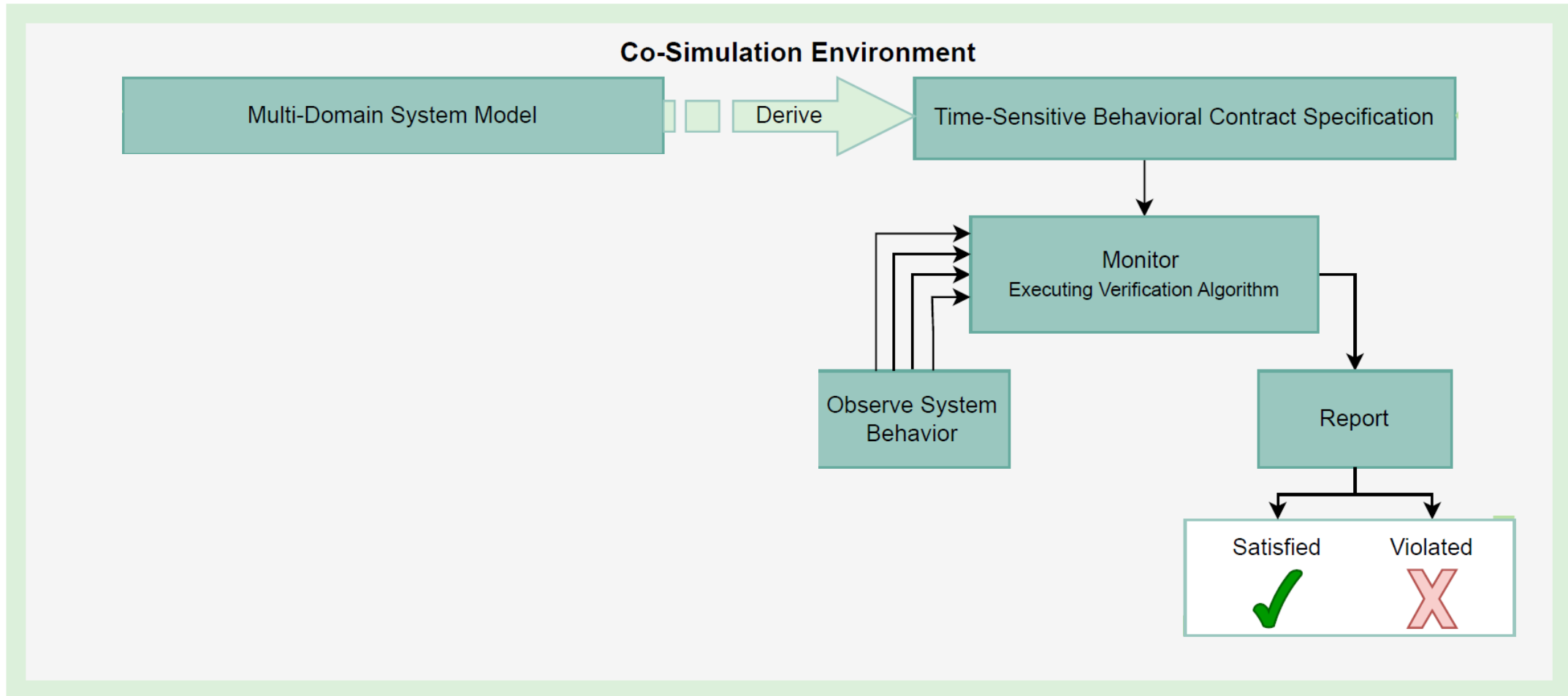
## Co-Simulation Environment

Time-Sensitive Behavioral Contract Specification

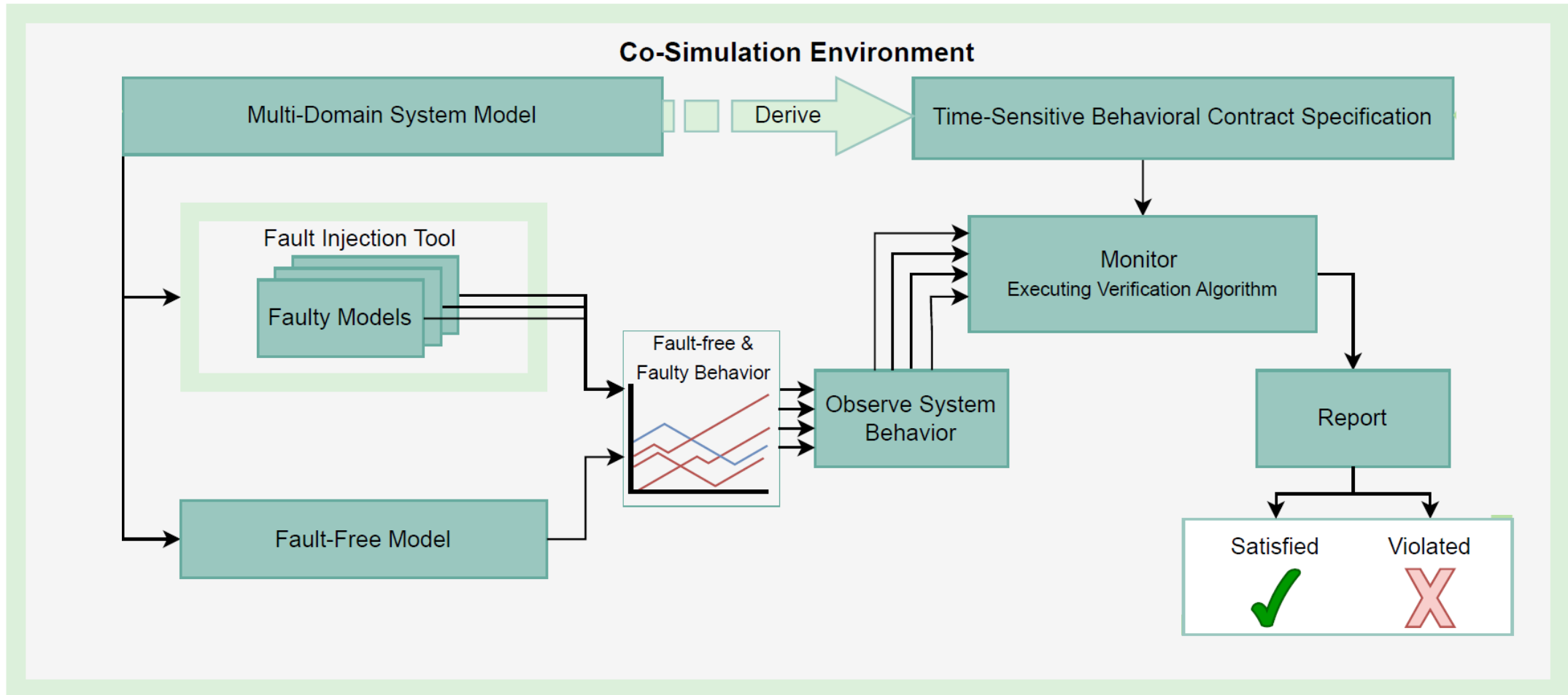
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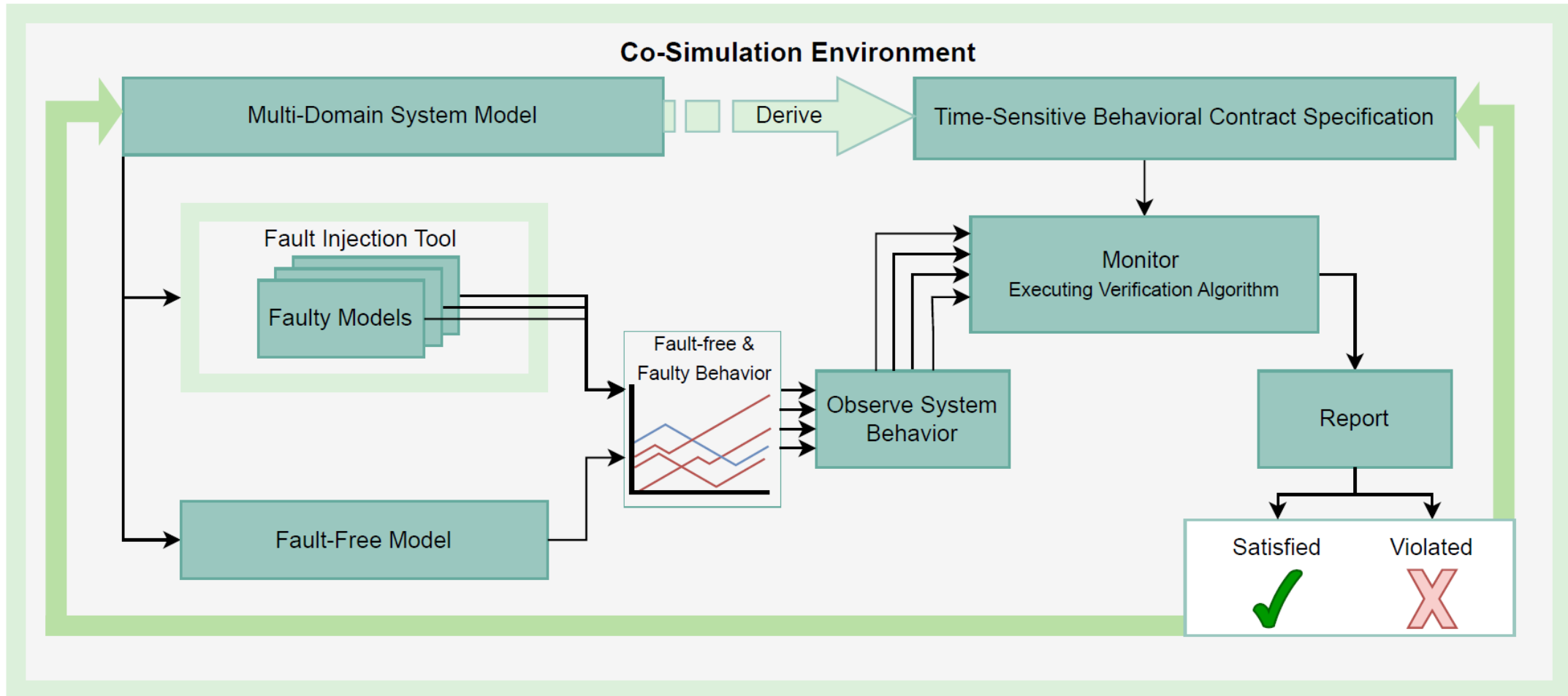
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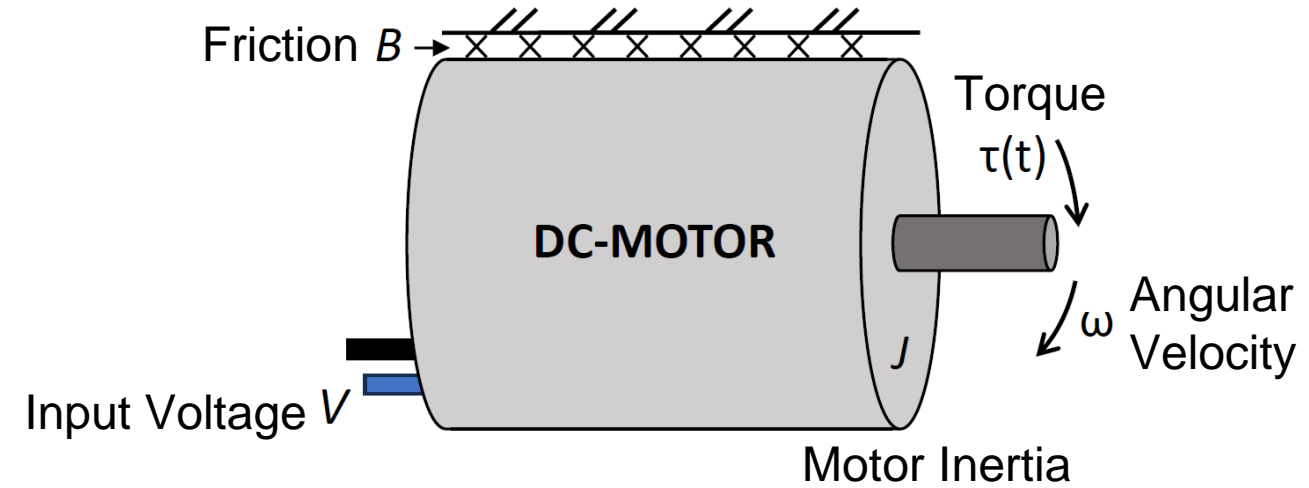
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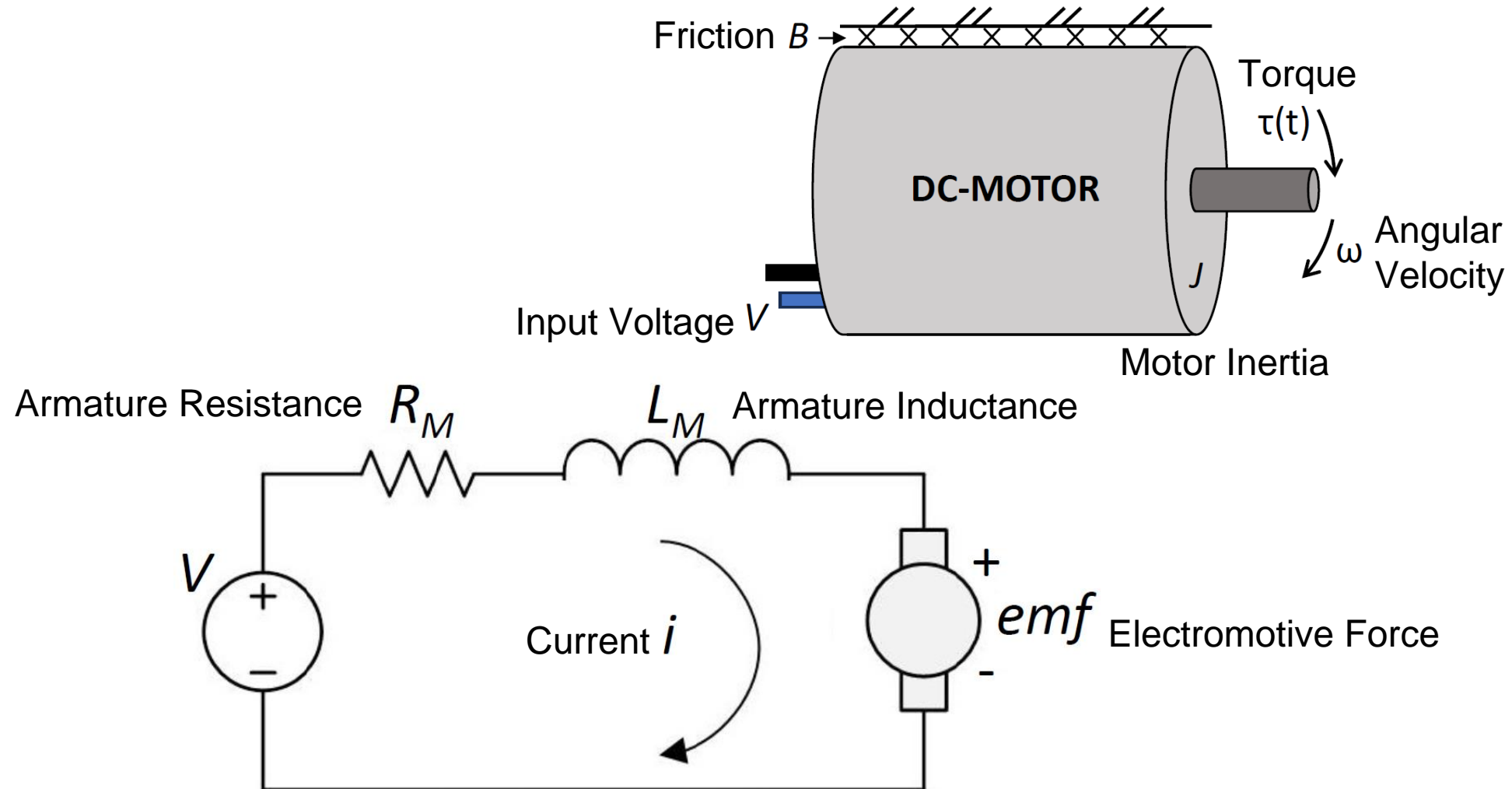
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## Use Case Study: Physical Model of a DC Motor



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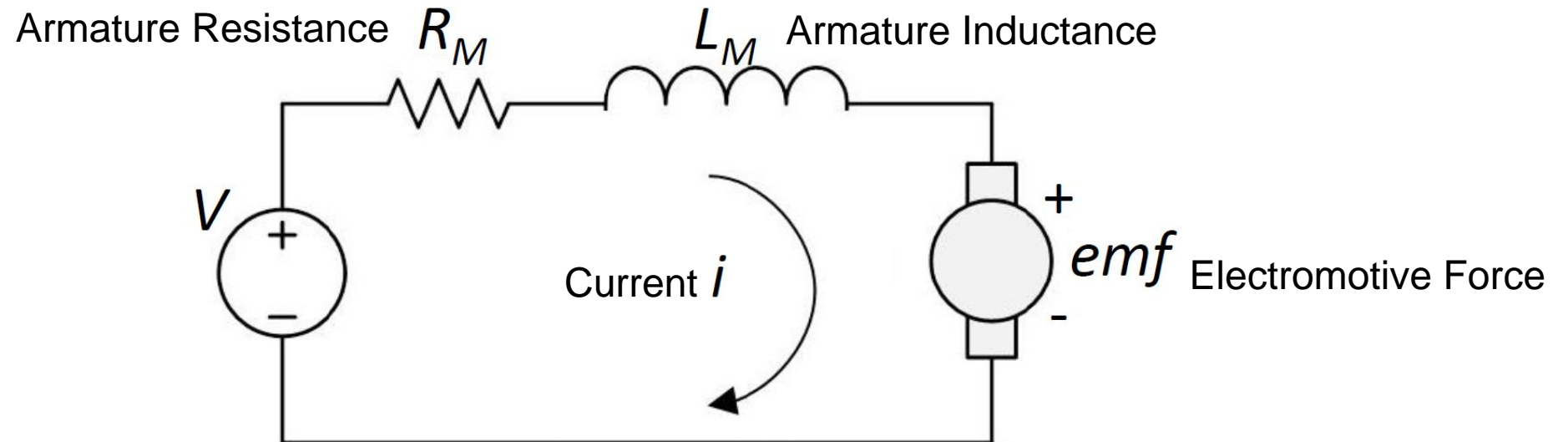
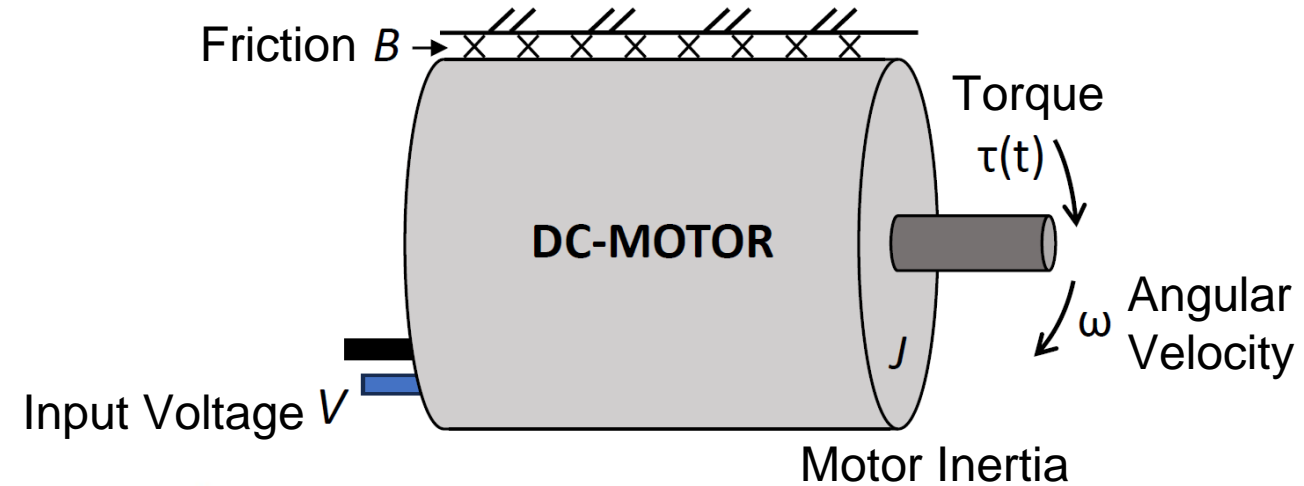




## Use Case Study: Physical Model of a DC Motor

Generate rotation of the shaft:

$$V = K_E \cdot \omega + R_M \cdot i + L_M \cdot \frac{di}{dt}$$



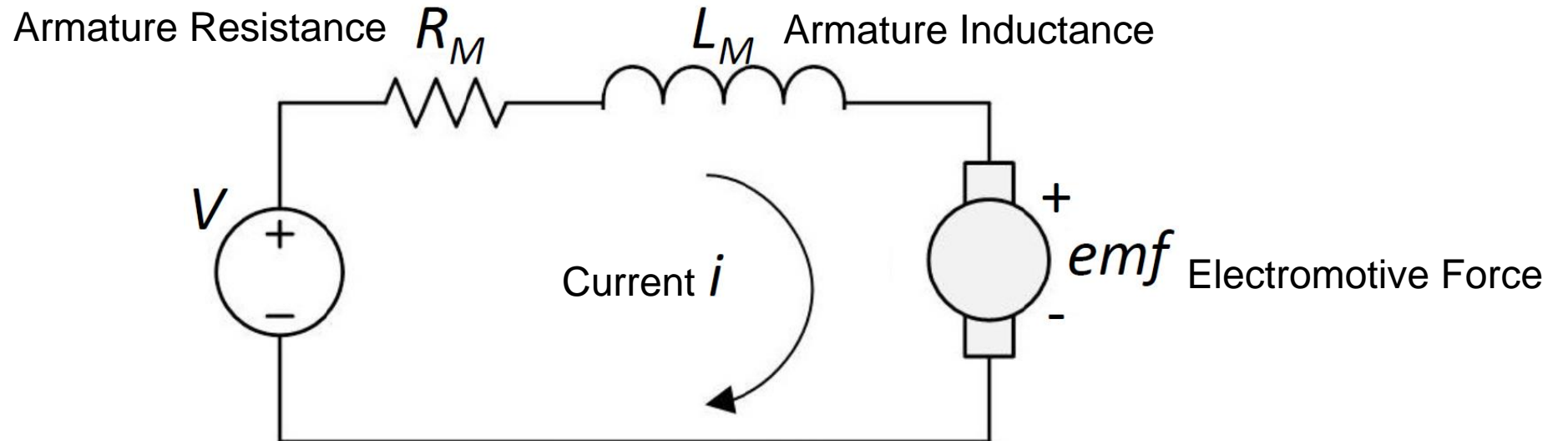
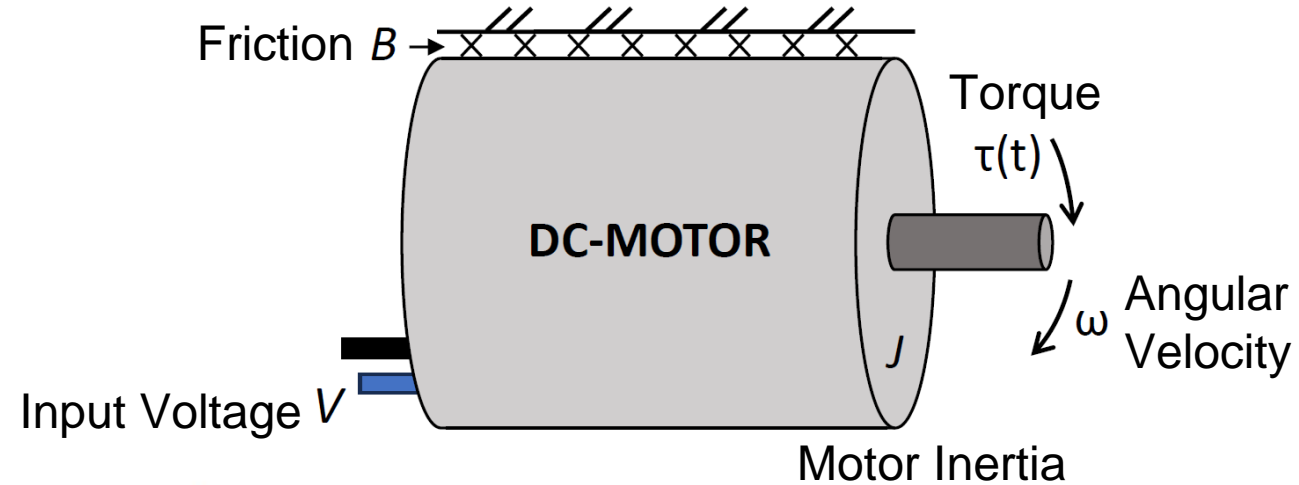
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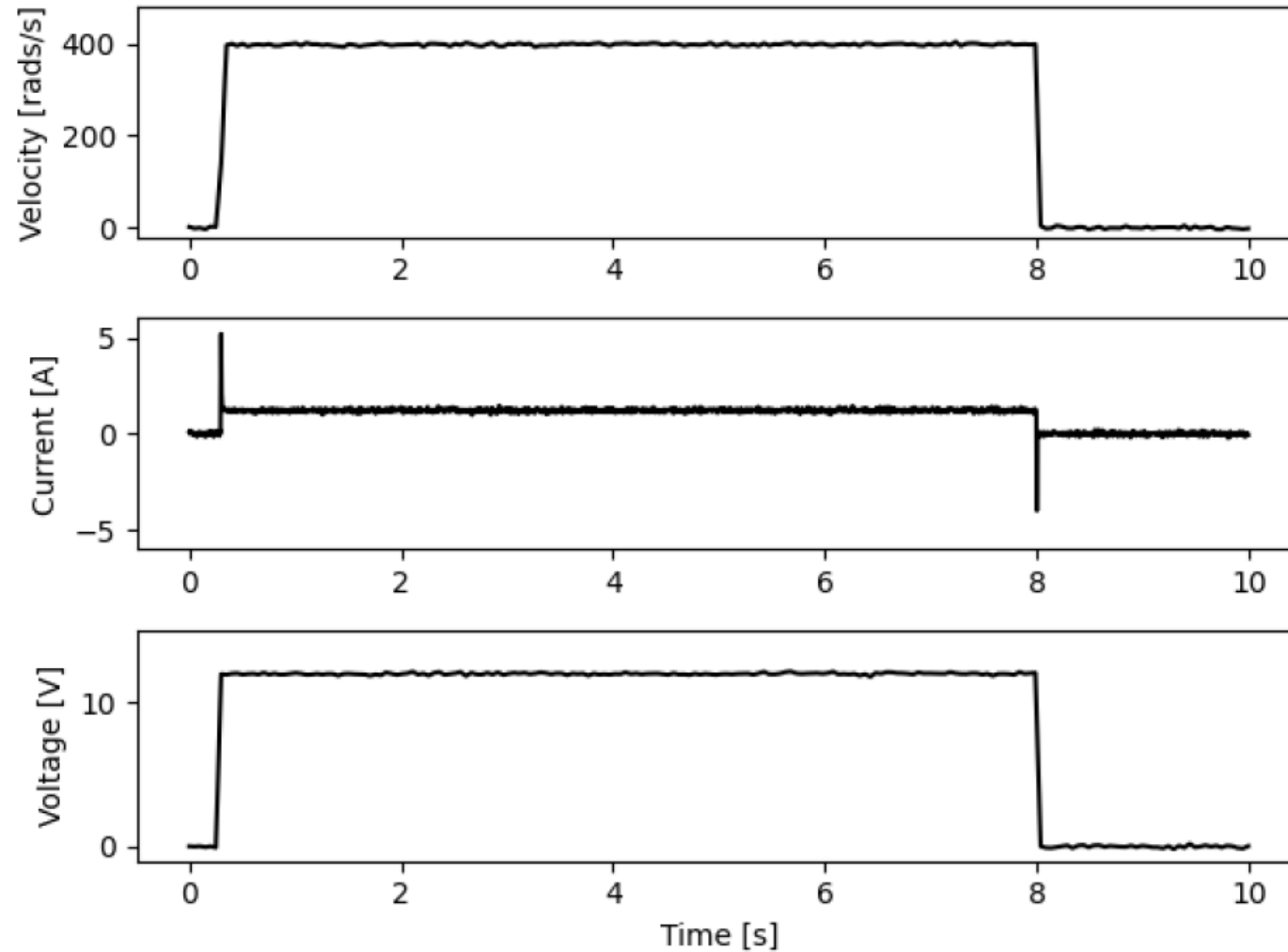
$$V = K_E \cdot \omega + R_M \cdot i + L_M \cdot \frac{di}{dt}$$

Mechanical load behavior:

$$\tau = K_T \cdot i - B \cdot \omega - J \cdot \frac{d\omega}{dt}$$



## Nominal Behavior of the DC Motor





## Contract-Based Monitoring & Fault Injection

- Time-Sensitive Behavioral Contracts (TSBCs)
  - Assumption: Time point is within a specific interval
  - Guarantee: Corresponding data value is within specified interval

$$C_i : t \in [t_1; t_2] ? d \in [d_1; d_2]$$



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- Electrical Fault  
 $V(p, n) <+ I(p, n) * \text{open};$   
amount of resistance  
↑

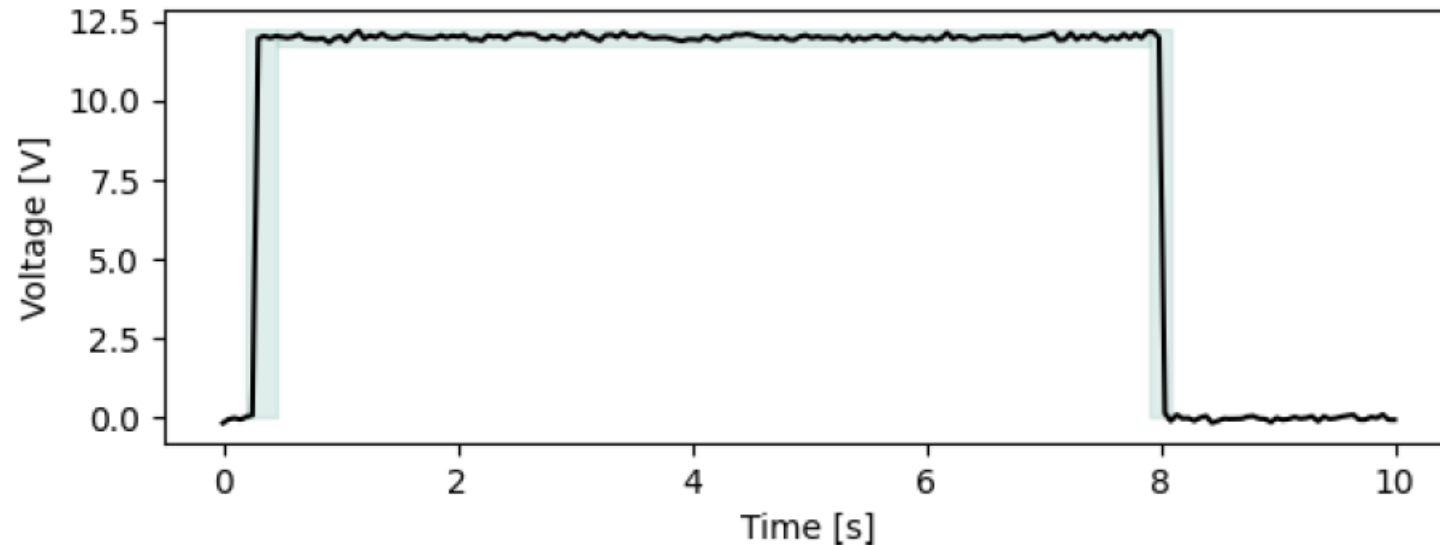
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- Electrical Fault  
amount of resistance  
 $V(p, n) <+ I(p, n) * \text{open};$
- Mechanical Fault  
slow down rotation  
 $\text{Tau}(x, y) <+ \text{Omega}(x, y) * \text{damp};$

## Valid Range & Contract Specification for Supply Voltage



White  
Gaussian noise  
was added

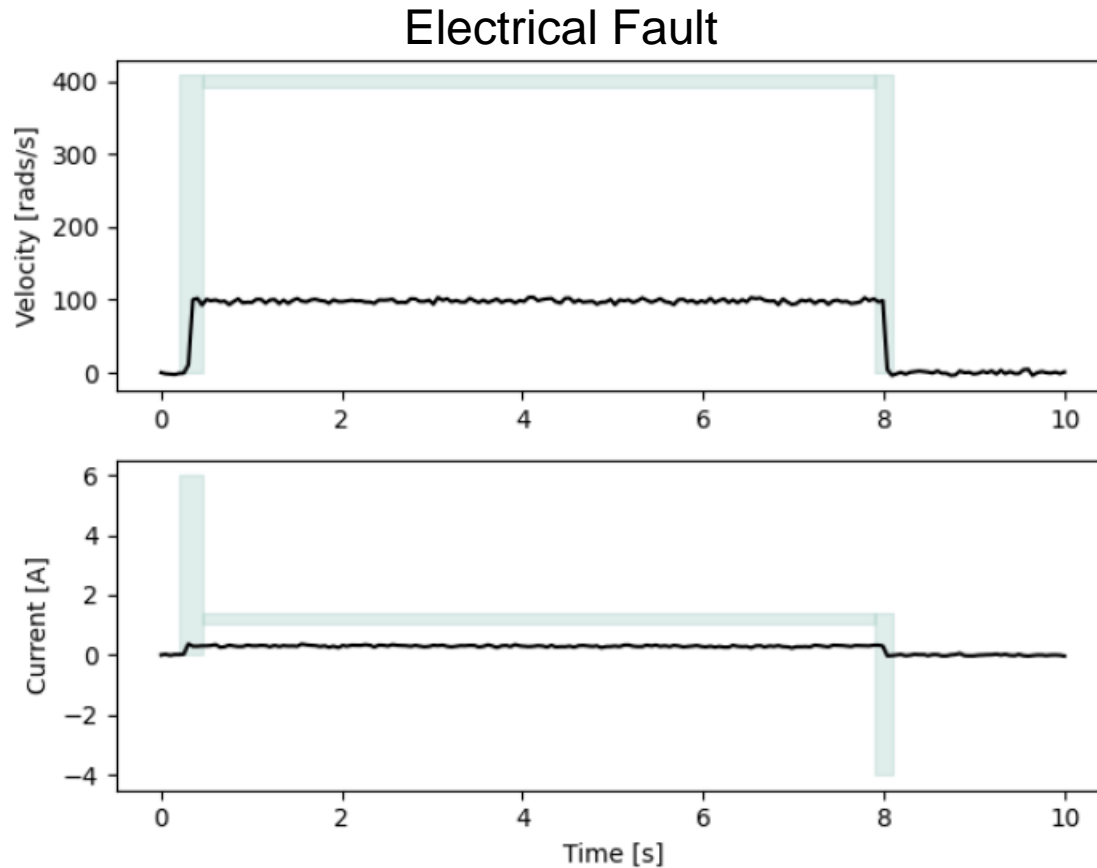
$$\text{Contract\_}C_1 : t \in [0.2; 0.45] \text{ ? } d \in [0; 12.24]$$

$$\text{Contract\_}C_2 : t \in [0.45; 7.9] \text{ ? } d \in [11.76; 12.24]$$

$$\text{Contract\_}C_3 : t \in [7.9; 8.1] \text{ ? } d \in [0; 12.24]$$

$$\text{Contract\_}C_4 : t \in [8.1; 10] \text{ ? } d = 0$$

## Possible Traces & Contract Violations



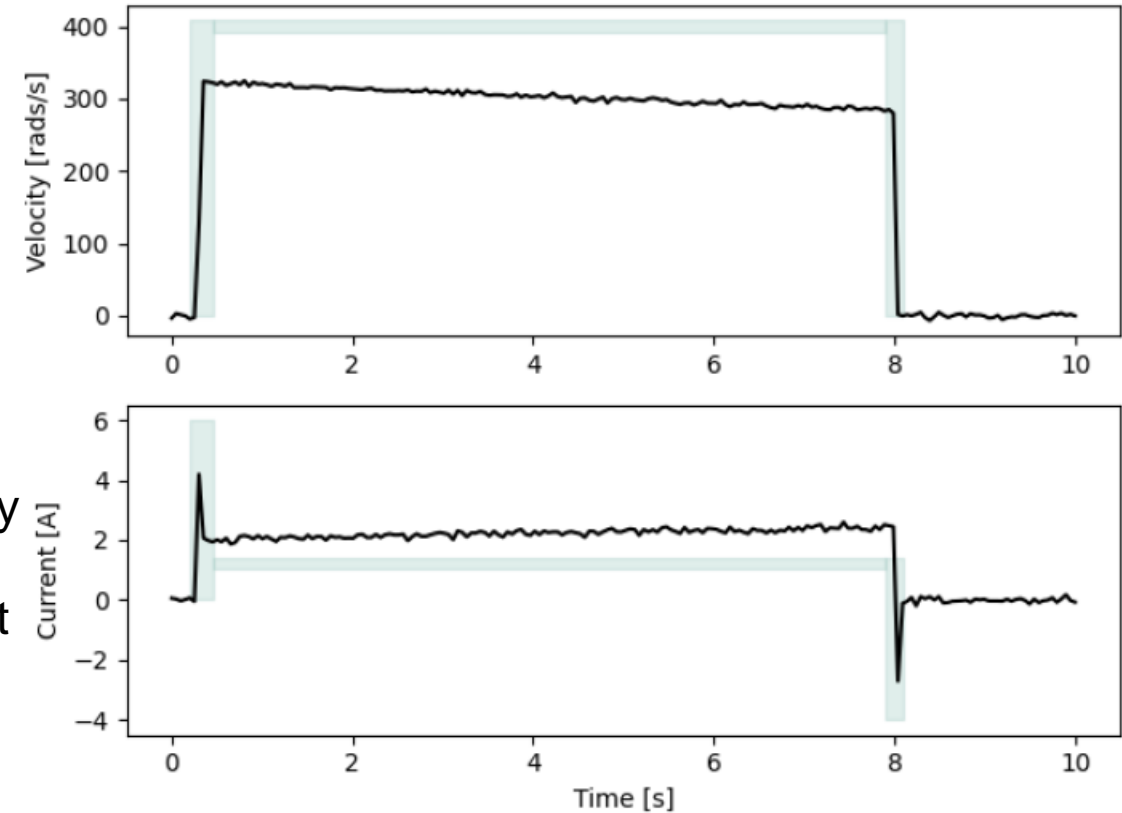
- Increased armature resistance
  - Wear and tear of electrical components
  - Badly placed connection
  - External electromagnetic interference
- Always active throughout simulation
  - Constant wear of the components
- Fault affects the electric current
- Fault affects angular velocity



## Possible Traces & Contract Violations

- Additional friction to rotary components
  - Presence of debris or dust
  - External agents slowing down the shaft rotation
  - Deterioration of bearings due to motor aging
- Fault is incremental and increases slightly
  - Increasingly severe effect of the fault
- Larger braking force than normal friction
- Decreasing the angular velocity

Mechanical Fault





## Monitoring Results – A Detected Violation

- Recoverable monitors
  - Continue verification in case of being successful in the future
  - Monitors fail once may pass within the same request
- Unrecoverable monitors
  - Halt verification until subsequent request
  - Once violated they remain so for the duration of the current request
  - Suitable for critical fault conditions intolerant of any violations
- Find reason for critical fault and decide
  - Are corrections needed? Improvements to the model or monitors?



## Monitoring Results – A Detected Violation

- Longer fault simulation
  - Analyze effect of a persistent fault
  - Reveal whether and how system controller mitigates the fault
- Based on severity user decides whether and how to intervene
- Simple change to the configuration: Correcting the input signal
- Changes to the contract specification
  - Relieve intervals and broaden spectrum of allowed values
  - This does not improve reliability – it prevents detection of smaller deviations
- Specify contracts systematically and consider precise requirements and behavior

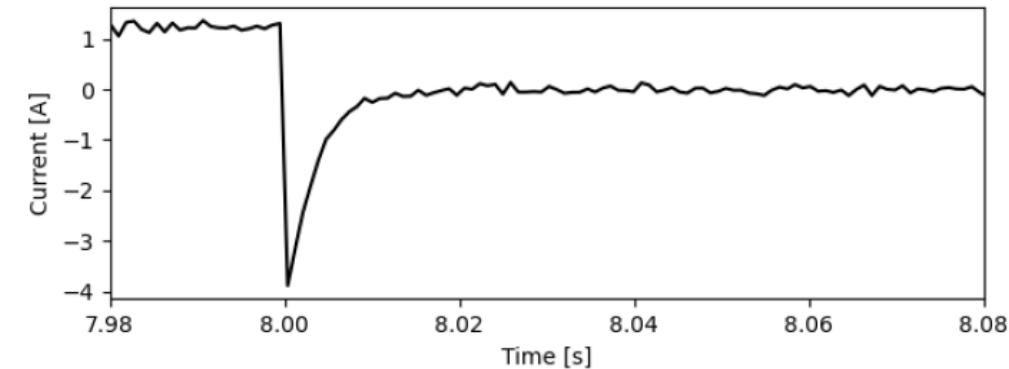


## Discussion

- A suitable fault detection mechanism that can be tested during the design phase
- Applicable to several systems that contain a physical part
  - Establish system model and its nominal behavior
  - Derive contract specifications
- Motor model could be extended to generate data on other properties (temperature, ...)
- Later fault detection requires more resources to rectify faults

## Discussion

- Check valid behavior for signals that are not directly measured or measurable
- E.g. Besides pure threshold classifier, use extended specification to consider gradient within a contract
  - Finer granularity of monitoring
  - Earlier detection of potential violations
- Specifying more precise progression
  - TSBCs could do this by adding monitors (overhead)
  - A solution for this can improve fault detection
- Effect of faults might also be visible in software & extend fault detection to predictive maintenance





## Summary

- A co-simulation environment that enables
  - Systematic approach for fault detection
  - Testing the behavior of a system under faulty conditions
  - Detect different faults through the use of TSBC monitors
- Faults are directly injected into the differential equations
- Reporting on the valid or invalid behavior of the system
- TSBC-based monitor specifications can be improved based on the provided results
- Monitors could be derived for application at run-time
- Extending the framework by a component for the control software