



University of Antwerp
| Faculty of Science

A Multi-Paradigm Modelling Foundation for Twinning Within the Context of Systems Engineering

Randy Paredis

Research Questions

- **RQ1:** *What are the most **common reasons/definitions** for (creating) **Digital Twins (DTs)**?*
- **RQ2:** *Given the large number of existing **DTs** in the literature, can we **unify**?*
- **RQ3:** *Is there a **relationship** between specific **DT requirements**, the system **architecture**, the used **models**, and the eventual **deployment**?*
- **RQ4:** *How to quantitatively support **deployment choices**?*
- **RQ5:** *How can we conveniently **combine multiple DTs** into a larger system?*

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Digital Twin?

Digital Twins consist of three components, a physical product, a virtual representation of that product, and the bi-directional data connections that feed data from the physical to the virtual representation, and information and processes from the virtual representation to the physical. [1]

A **Digital Twin** is an integrated multi-physics, multi-scale, probabilistic simulation of a vehicle or system that uses the best available physical models, sensor updates, fleet history, etc., to mirror the life of its flying twin. The digital twin is ultra-realistic and may consider one or more important and interdependent vehicle systems. [5]

A **Digital Twin** is a coupled model of the real machine that operates in the cloud platform and simulates the health condition with an integrated knowledge from both data driven analytical algorithms as well as other available physical knowledge. [7]

Digital Twins is a unified system model that can coordinate architecture, mechanical, electrical, software, verification, and other discipline-specific models across the system lifecycle, federating models in multiple vendor tools and configuration-controlled. [8]

Digital Twins are software systems comprising data, models and services to interact with a CPPS for a specific purpose. [9]

The **Digital Twin** is a set of virtual information constructs that fully describes a potential or actual physical manufactured product from the micro atomic level to the macro geometrical level. At its optimum, any information that could be obtained from inspecting a physical manufactured product can be obtained from its Digital Twin. [2]

Digital Twins are a virtual representation of the physical objects, processes and real-time data involved throughout a product life-cycle. [3]

A **Digital Twin** is an ultra-realistic virtual counterpart of a real-world object. [4]

A **Digital Twin** is an ultra-realistic, cradle-to-grave computer model of an aircraft structure that is used to assess the aircraft's ability to meet mission requirements. [6]

[1] D. Jones et al. 2020. "Characterising the Digital Twin: A systematic literature review". In *CIRP Journal of Manufacturing Science and Technology*.

[2] M. Grieves. 2017. "Digital Twin: Mitigating Unpredictable, Undesirable Emergent Behavior in Complex Systems". In *Transdisciplinary Perspectives on Complex Systems*.

[3] W. D. Lin and M. Y. H. Low. 2019. "Concept and implementation of a cyber-physical digital twin for a SMT line". In *2019 IEEE International Conference on Industrial Engineering and Engineering Management (IEEM)*.

[4] H. Park et al. 2019. "Challenges in Digital Twin Development for Cyber-Physical Production Systems". In *Cyber-Physical Systems. Model-Based Design*.

[5] E. Glaessgen and D. Stargel. 2012. "The digital twin paradigm for future NASA and U.S. Air Force vehicles". In *Proc. 53rd AIAA/ASME/ASCE/AHS/ASC Struct. Struct. Dyn. Mater. Conf.*

[6] B. T. Gockel et al. 2012. "Challenges with Structural Life Forecasting using Realistic Mission Profiles". In *53rd AIAA/ASME/ASCE/AHS/ASC Struct. Struct. Dyn. Mater. Conf.*

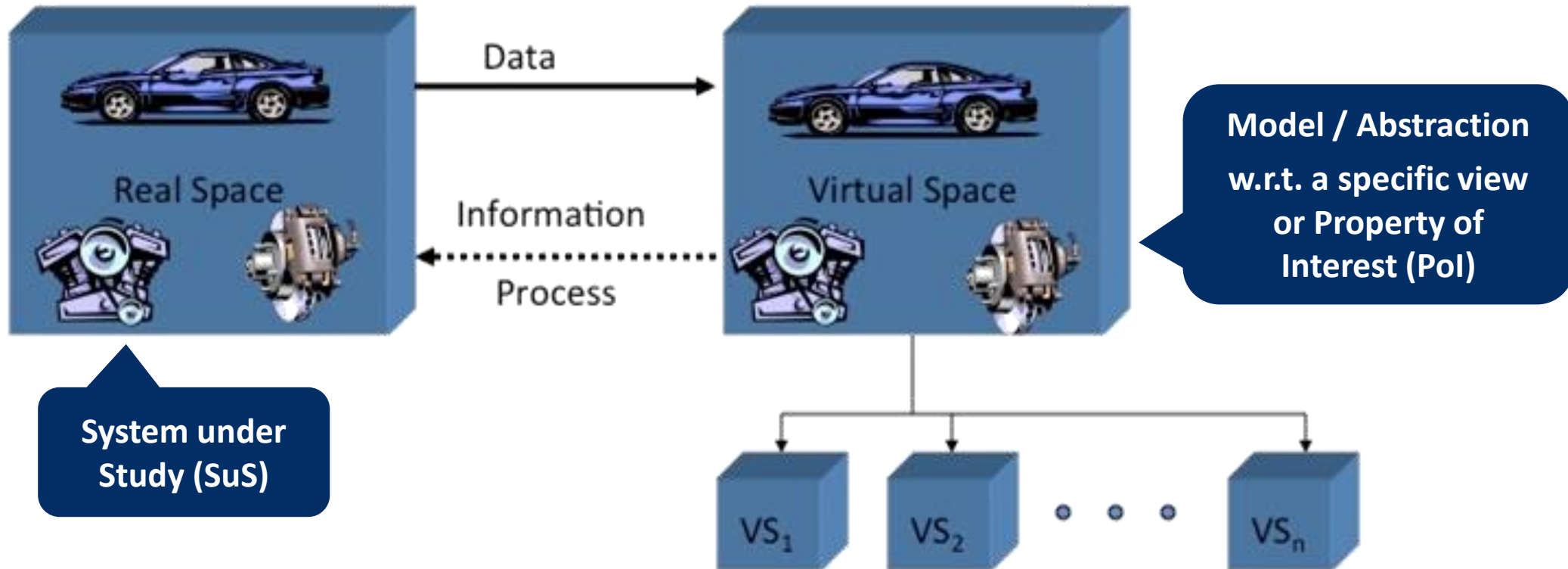
[7] J. Lee. et al. 2013. "Recent advances and trends in predictive manufacturing systems in big data environment". In *Manufacturing Letter 1*.

[8] M. Bajaj, D. Zwemer and B. Cole. 2016. "Integrating System Models with Architecture to Geometry". In *AIAA Sp. Forum*.

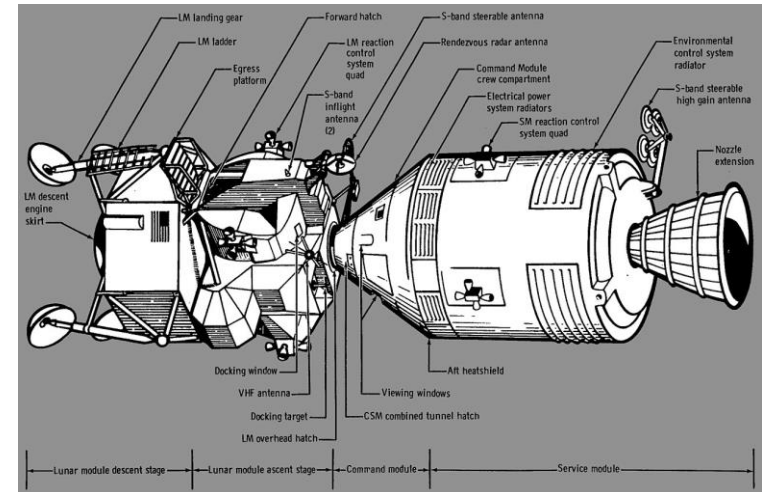
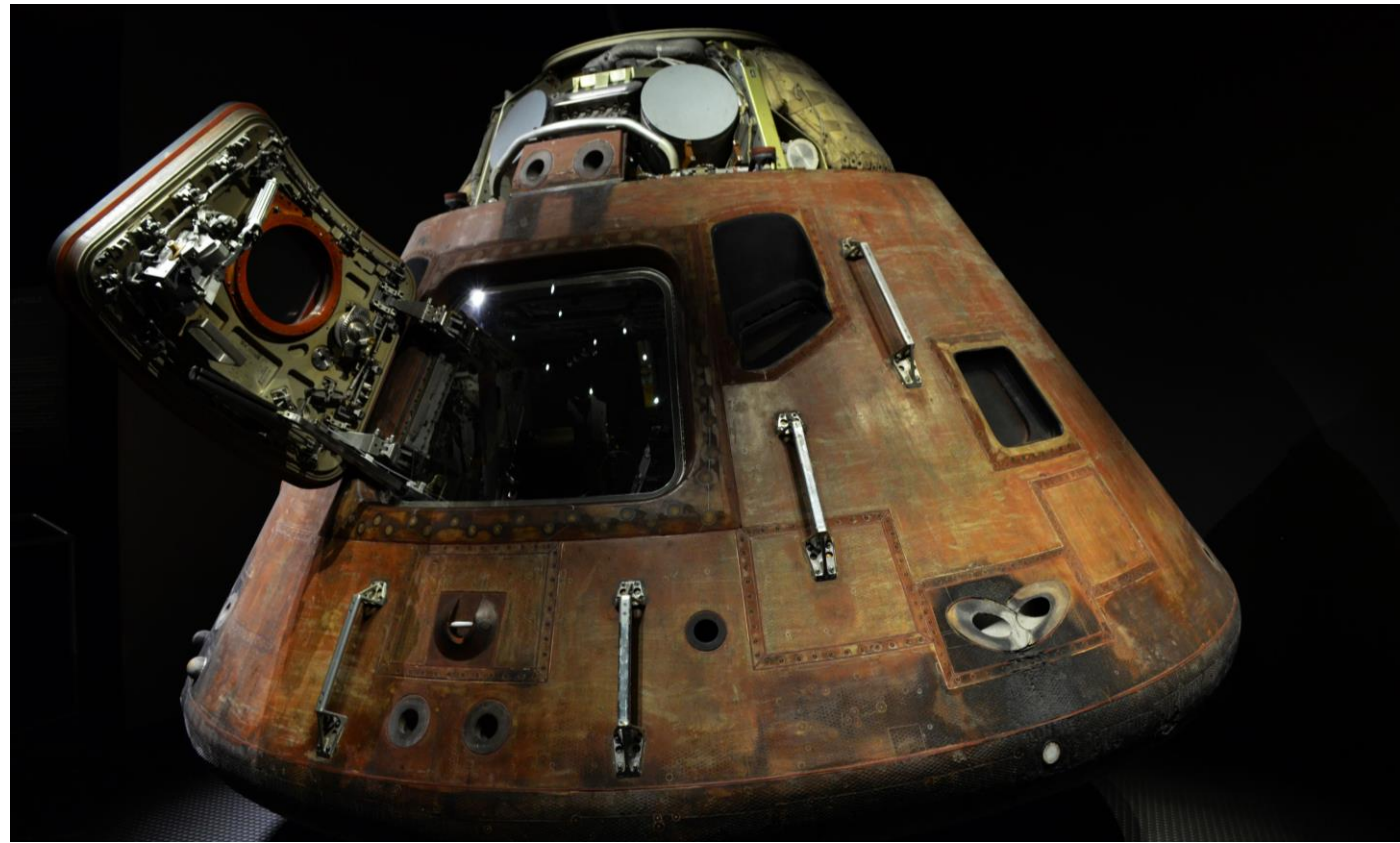
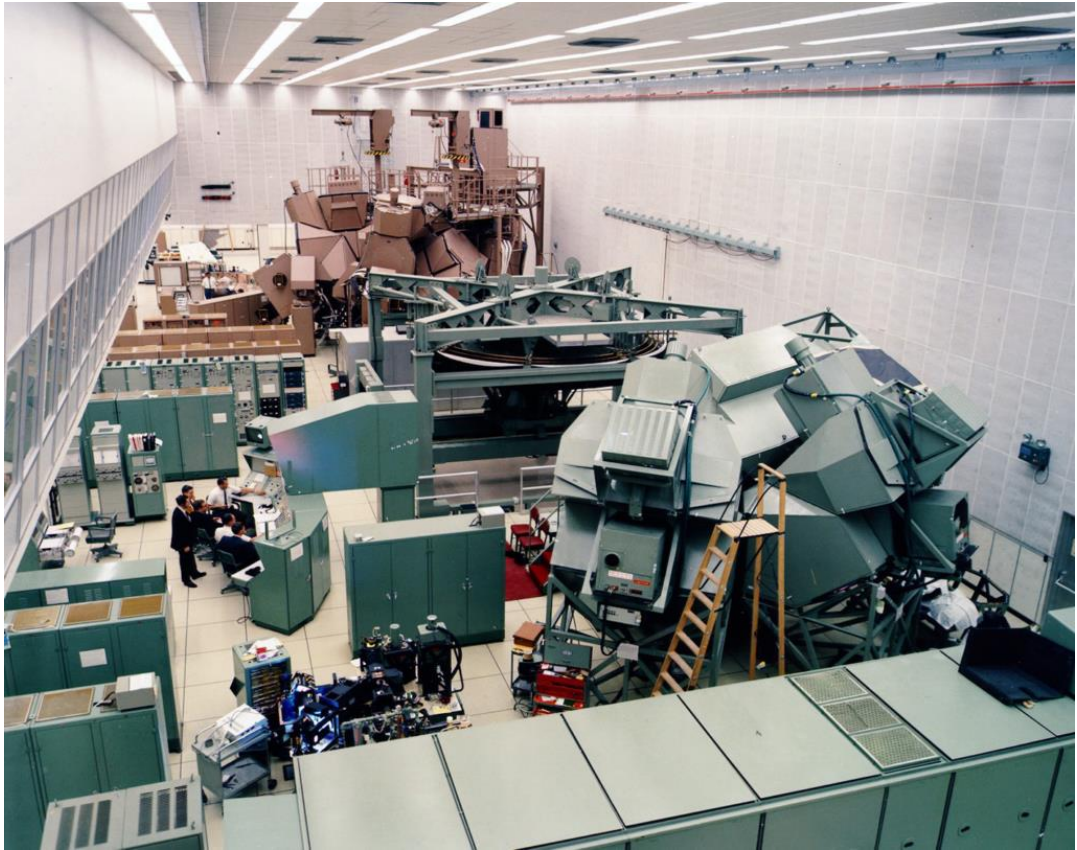
[9] P. Bibow et al. 2020 "Model-Driven Development of a Digital Twin for Injection Molding". In *CAiSE 2020. LNCS*.

... and many more!

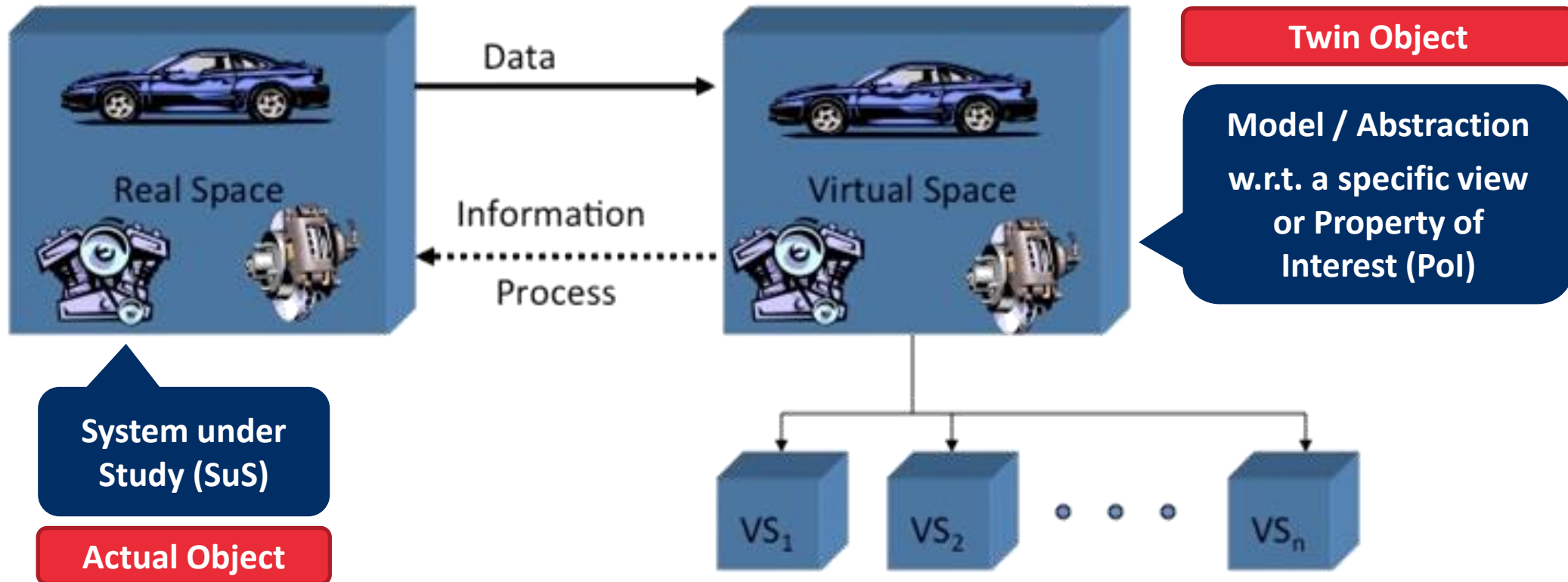
Conceptual Ideal for PLM



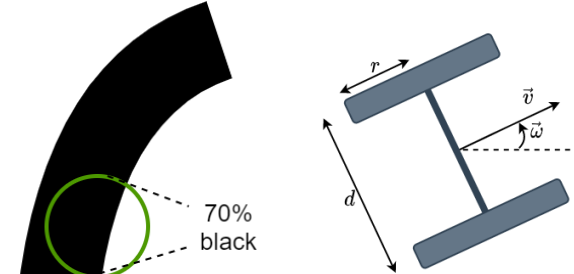
Apollo 13



Conceptual Ideal for PLM



Proof-of-Concept: Line Following Robot



$$\dot{\phi}_L = \frac{1}{r} \left(\dot{v} - \frac{\dot{\omega} \cdot d}{2} \right)$$

$$\dot{\phi}_R = \frac{1}{r} \left(\dot{v} + \frac{\dot{\omega} \cdot d}{2} \right)$$

AGV Recognition Homographic Transformation Depth Vision

Screen Grab

Stop Recording

Hardware Reset

Epsilon: 0.010

Close Clipping (meters): 0.84

Far Clipping (meters): 0.88

Transparency of Path: 0.15

Top Left: (0, 0)

Top Right: (640, 0)

Bottom Left: (0, 480)

Bottom Right: (640, 480)

Reset Coordinates

Draw Contours (close fit)

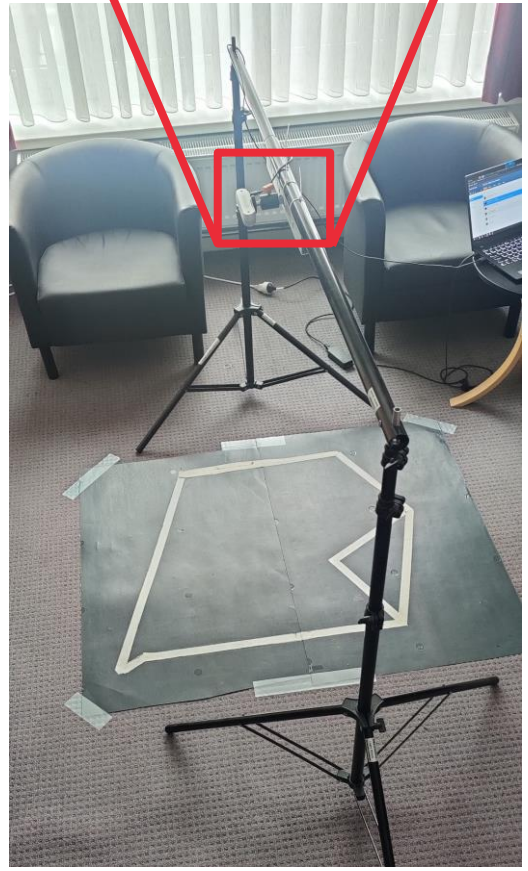
Draw Contour Bounding Box

Draw Rotated Rectangle

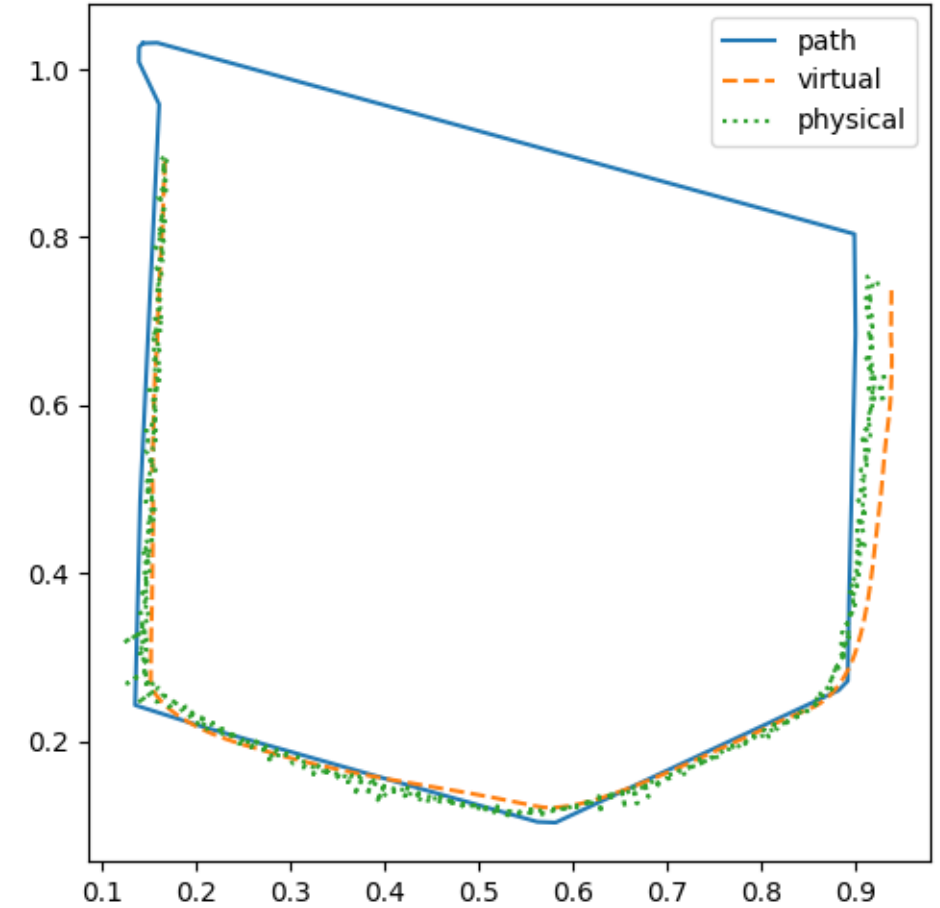
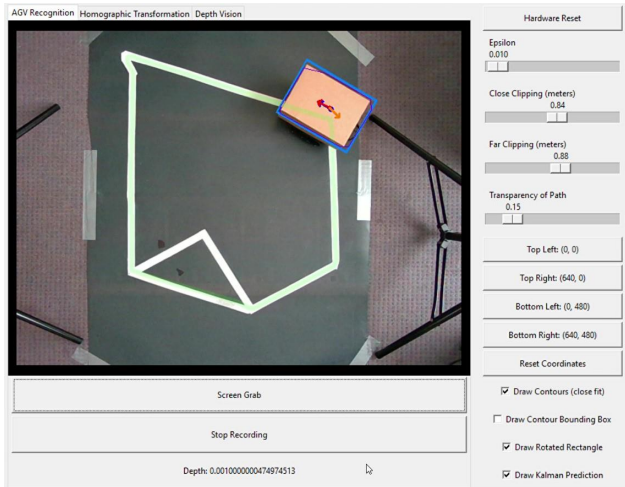
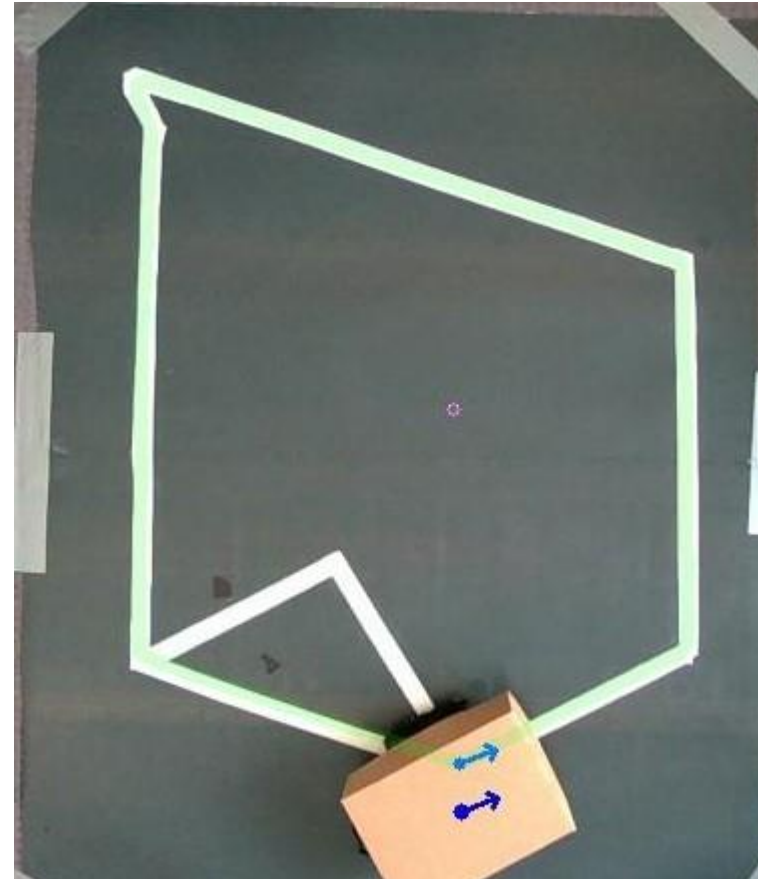
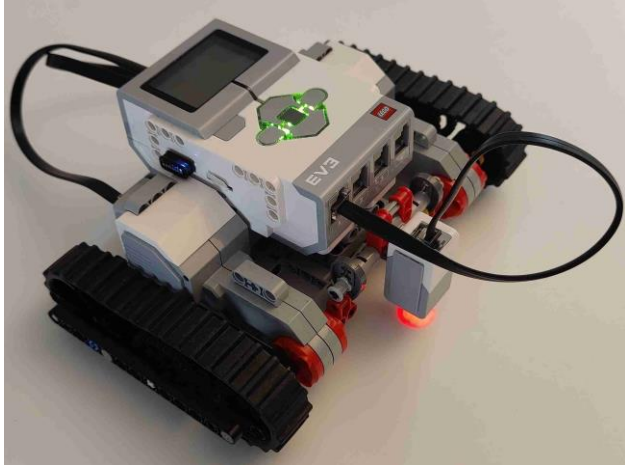
Draw Kalman Prediction

AGVVirtual

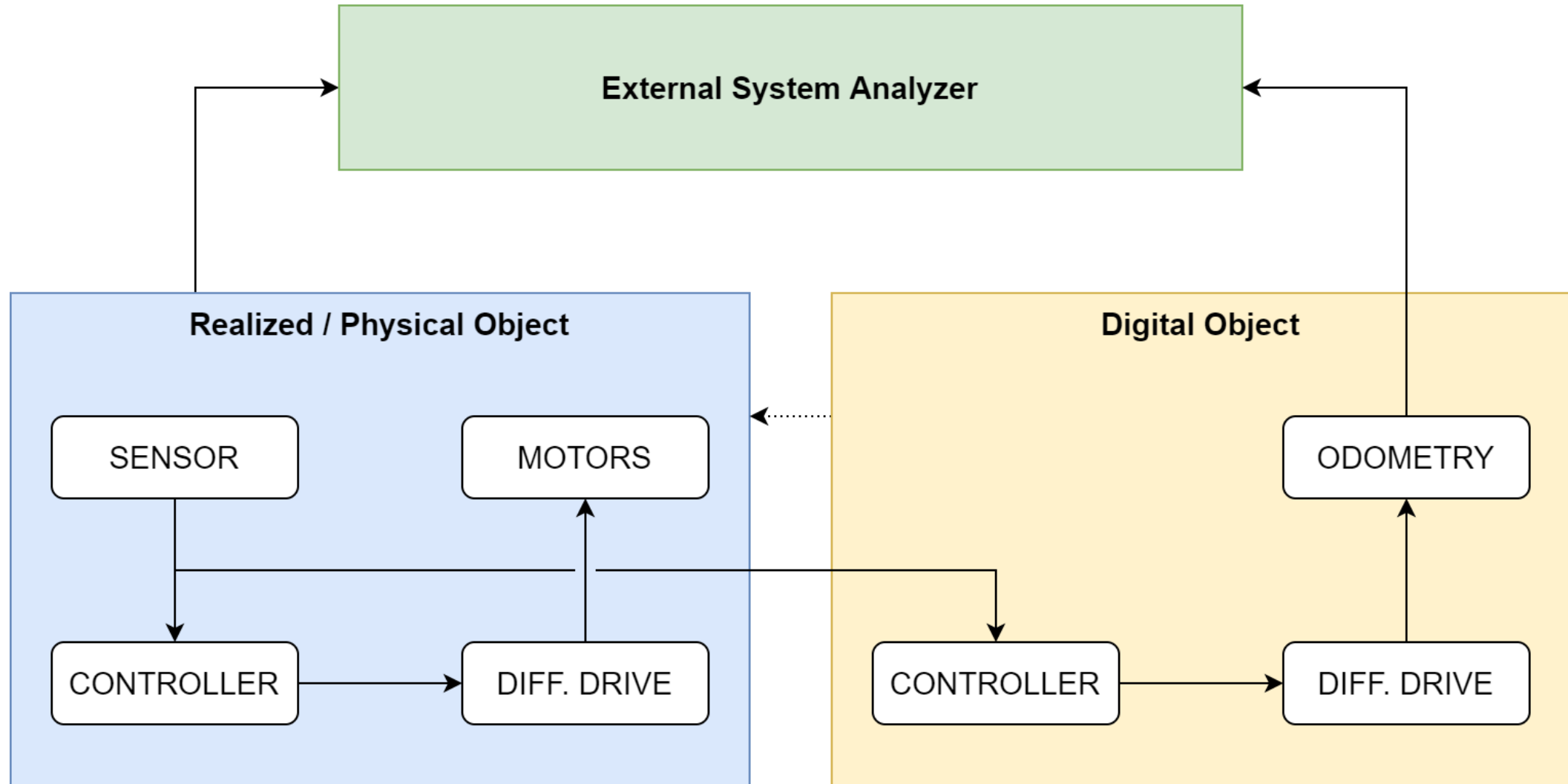
Controller



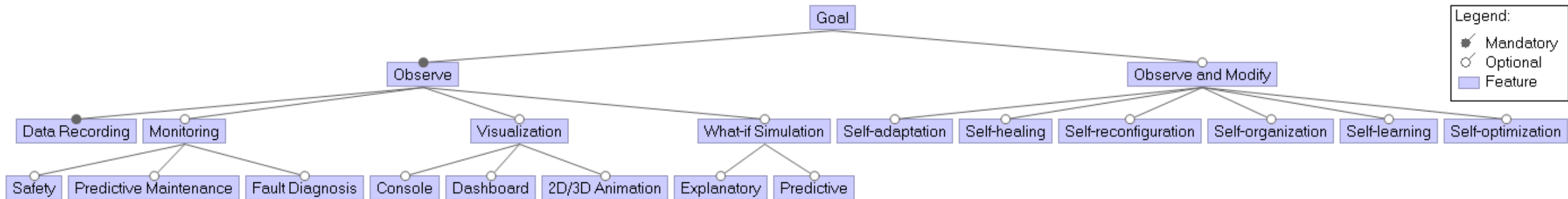
Proof-of-Concept: Line Following Robot



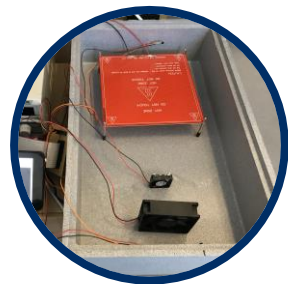
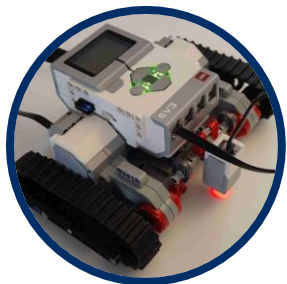
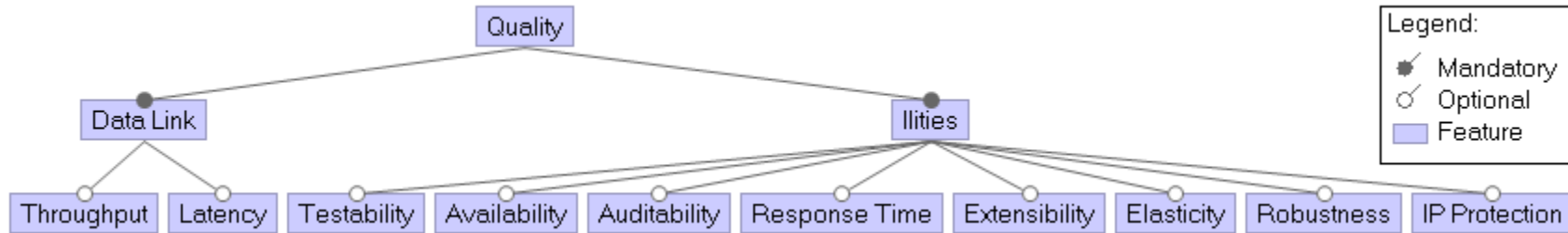
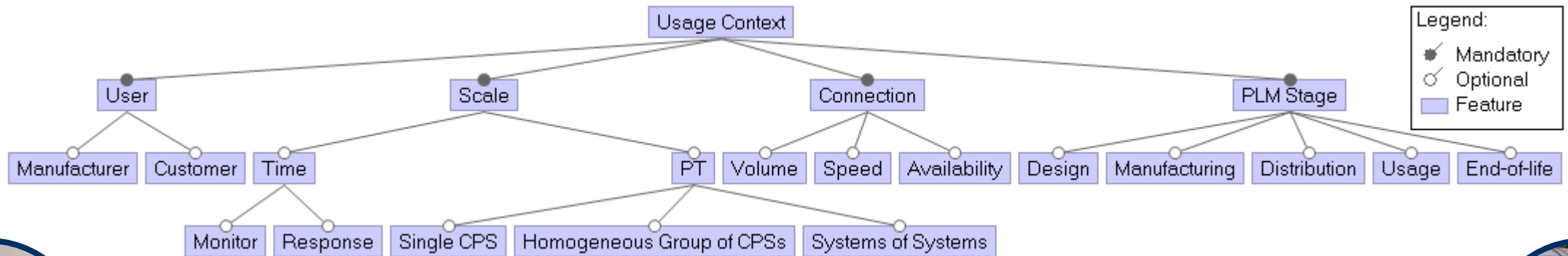
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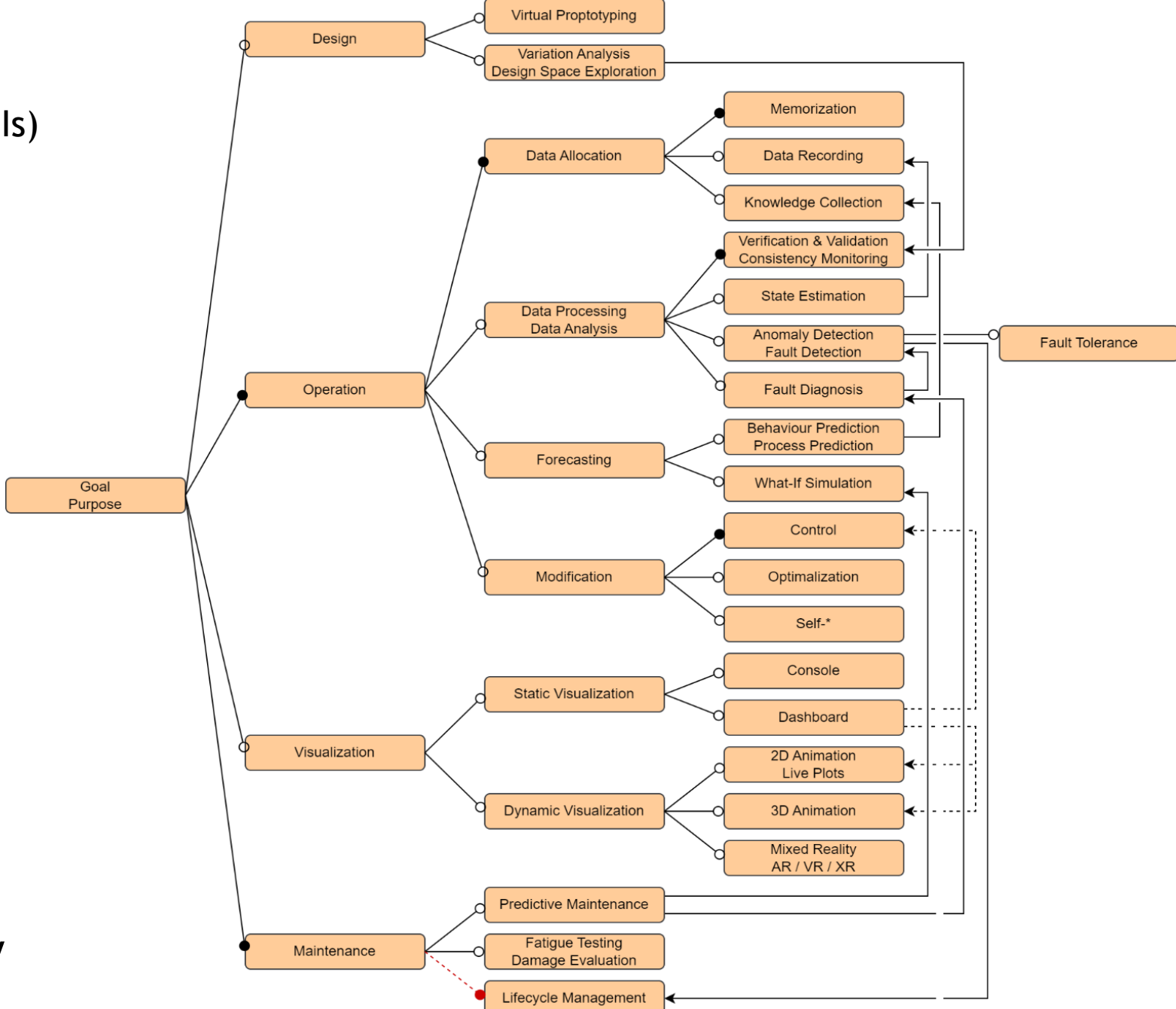
LFR vs Incubator



"Fault Diagnosis" = "Predictive Maintenance"

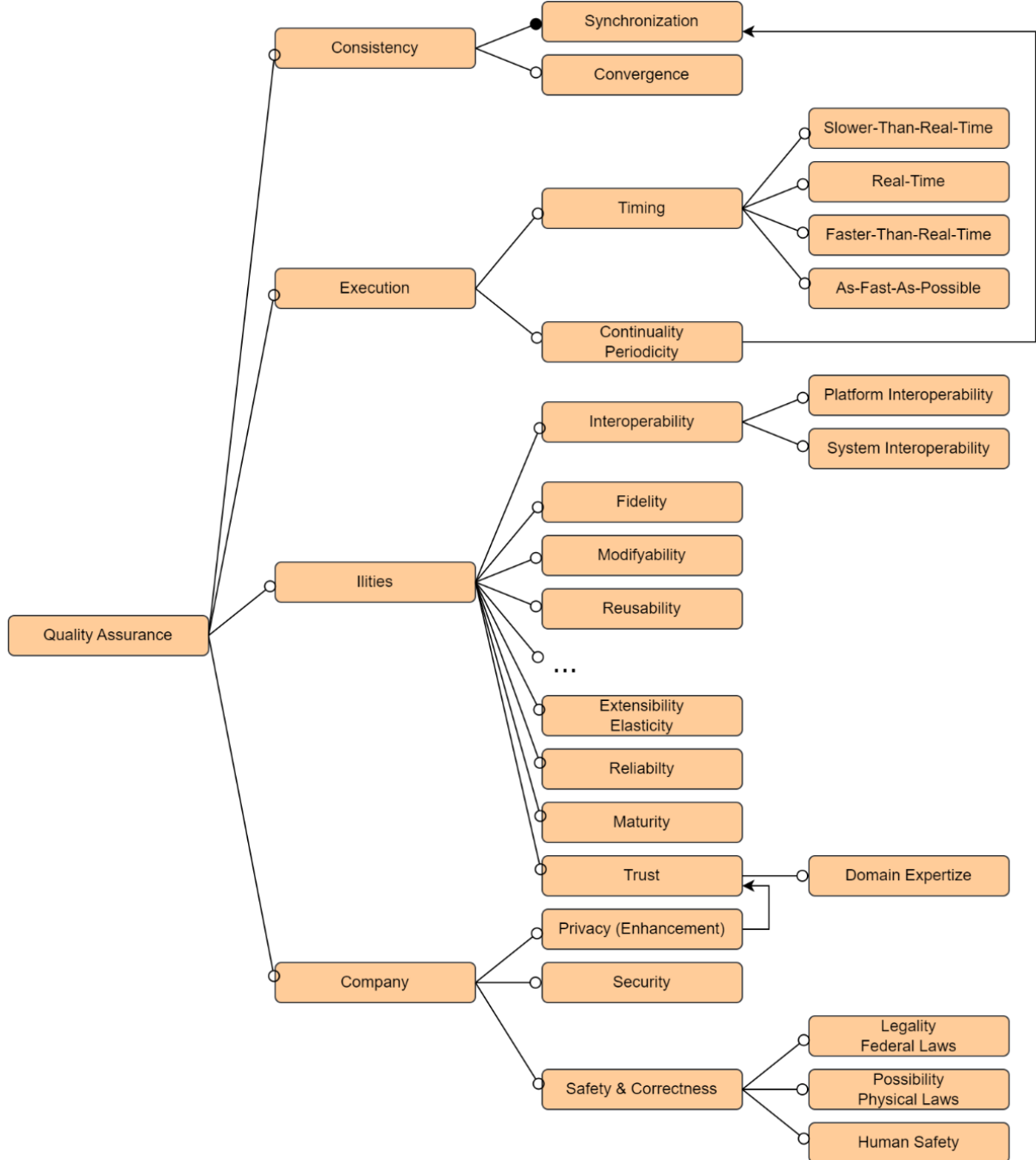


Goals w.r.t. their Properties of Interest (Pols)



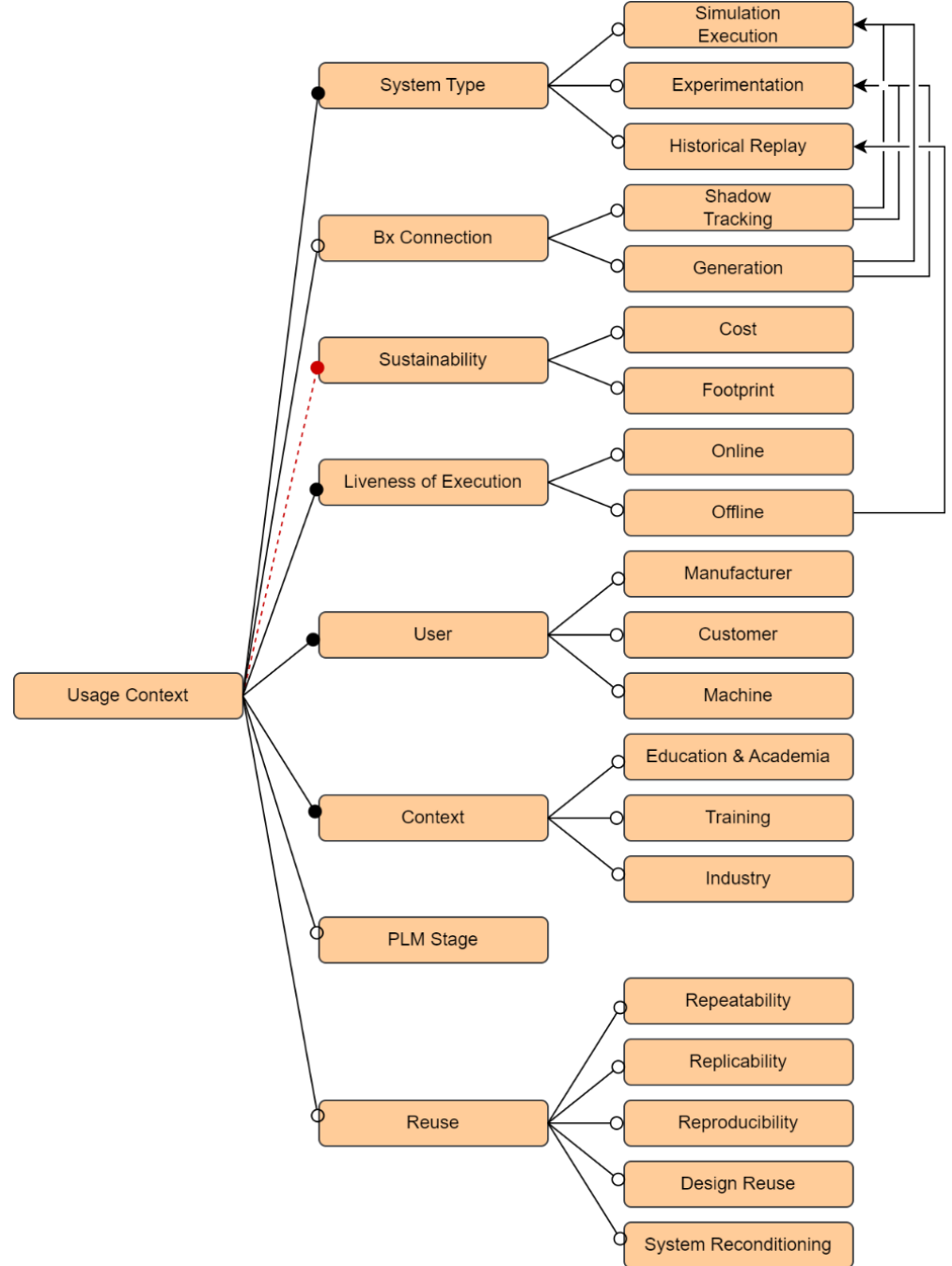
“feature model” to capture variability

Quality Assurance



“feature model”
to capture variability

Usage Context

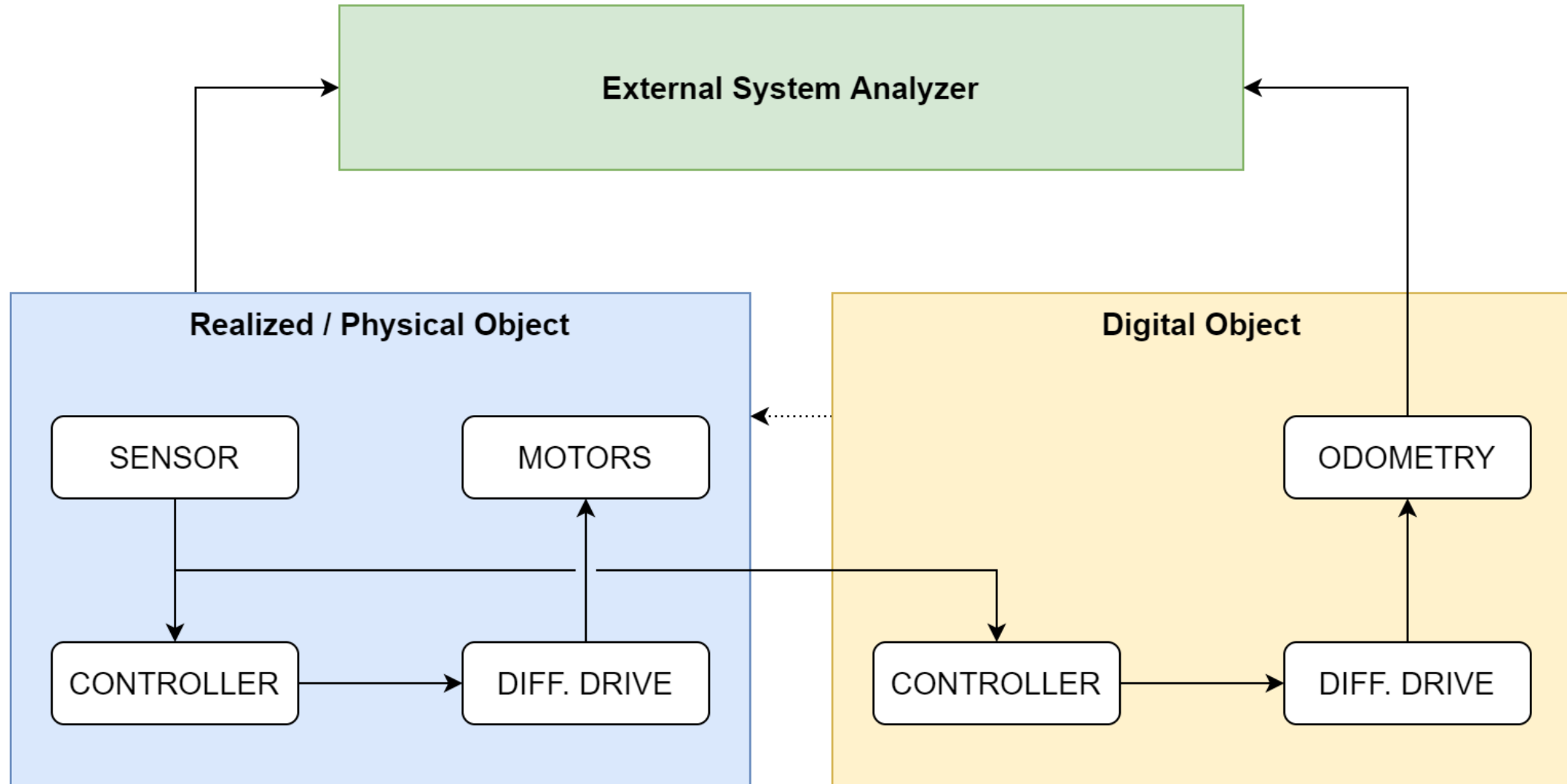


“feature model”
to capture variability

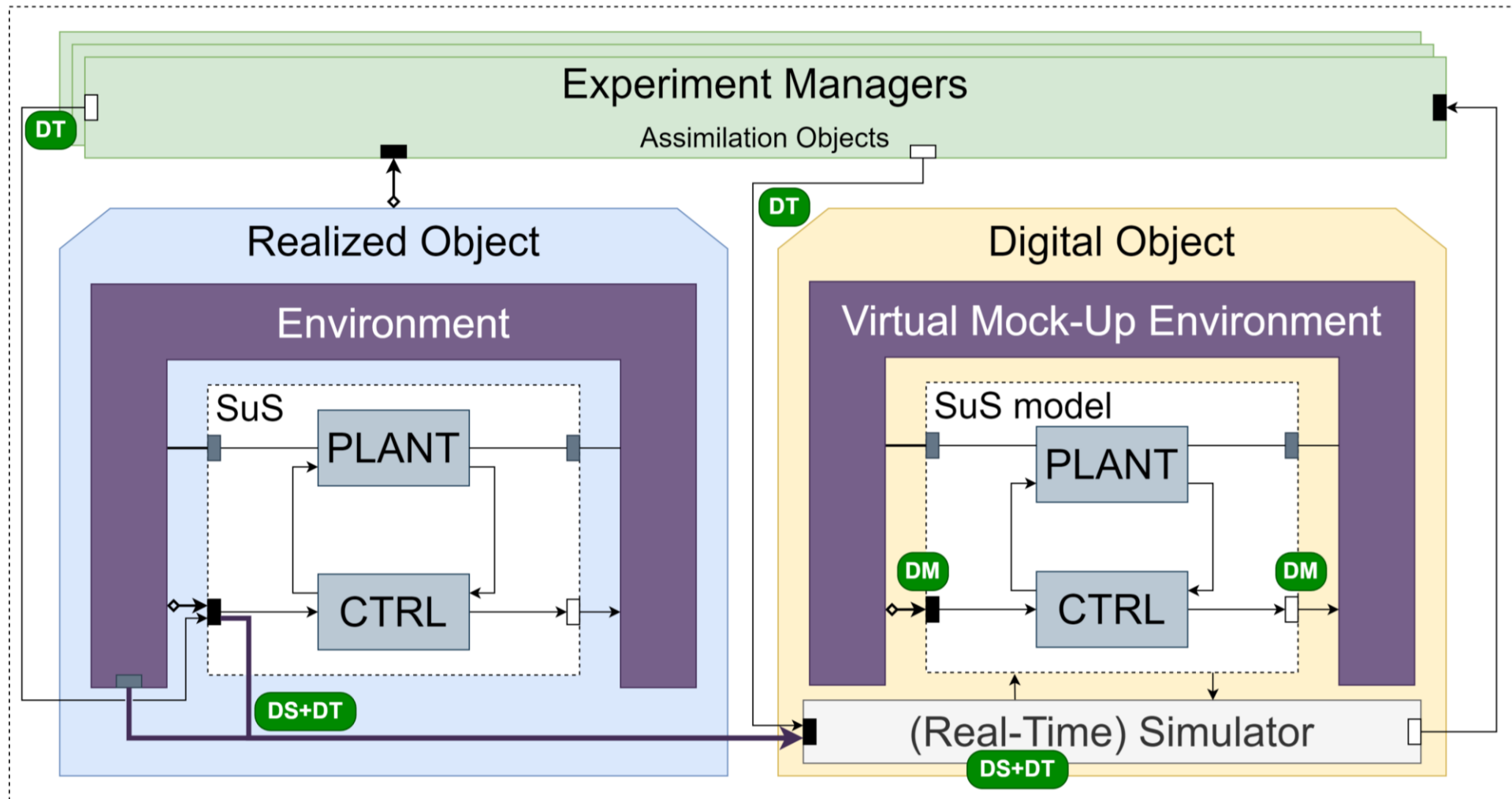
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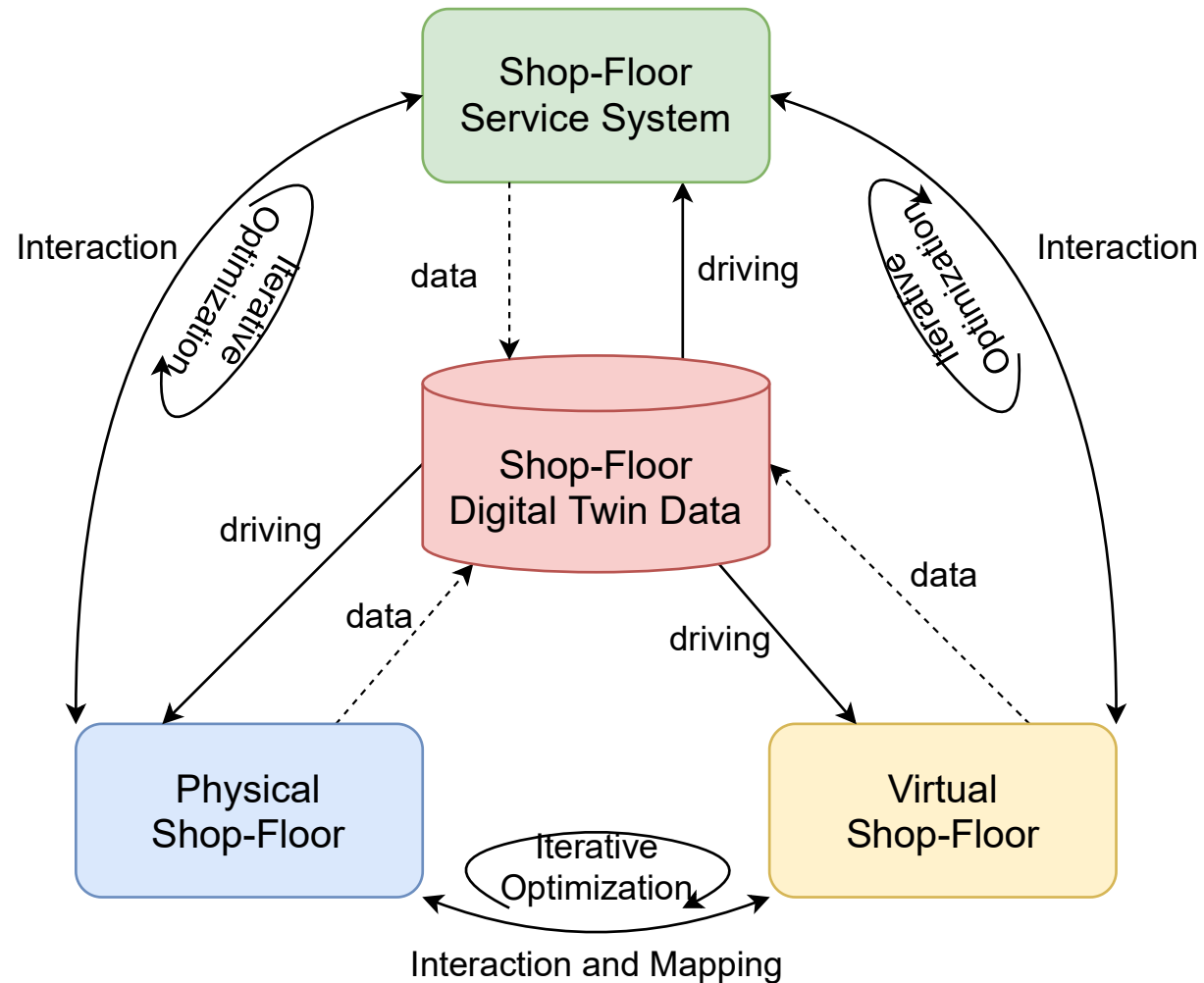
Proof-of-Concept: Line Following Robot



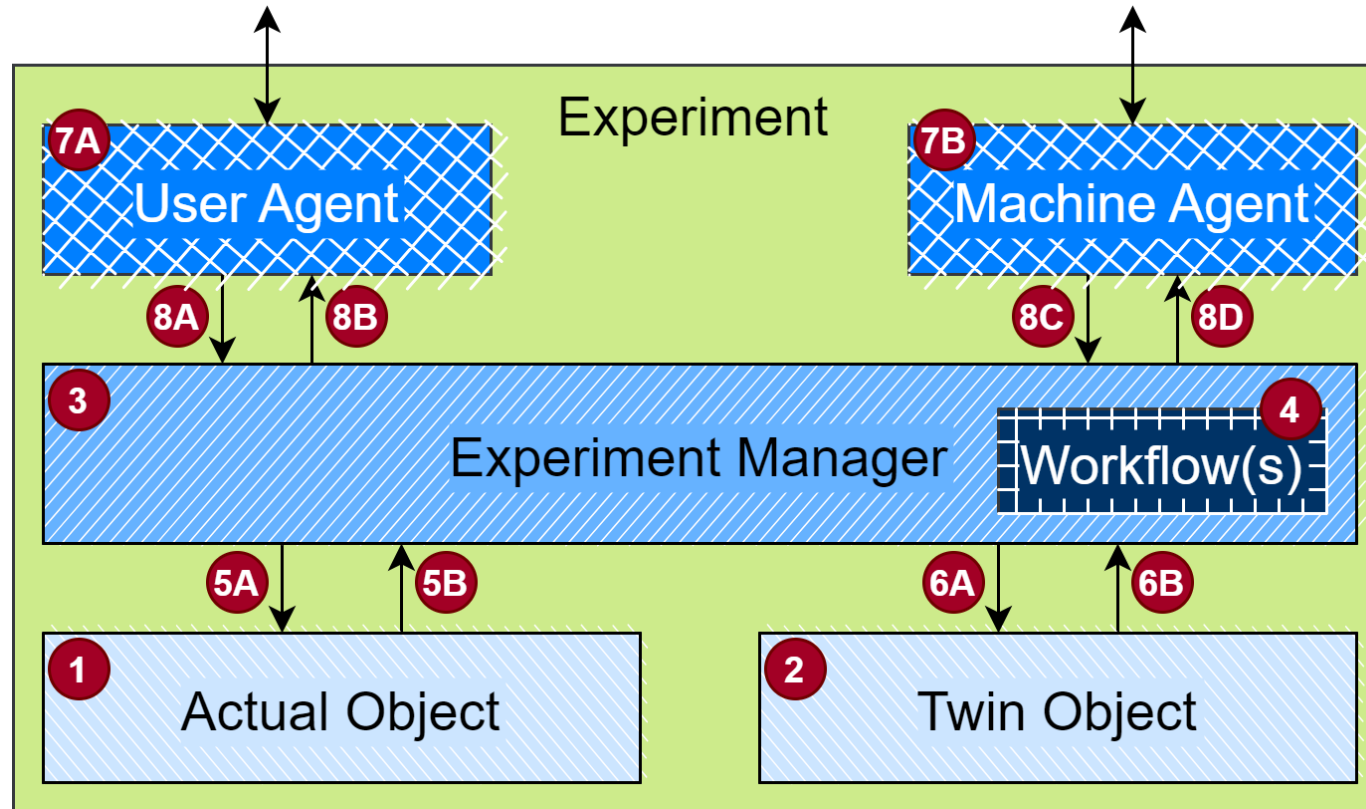
Digital Z Architecture



5D Architecture

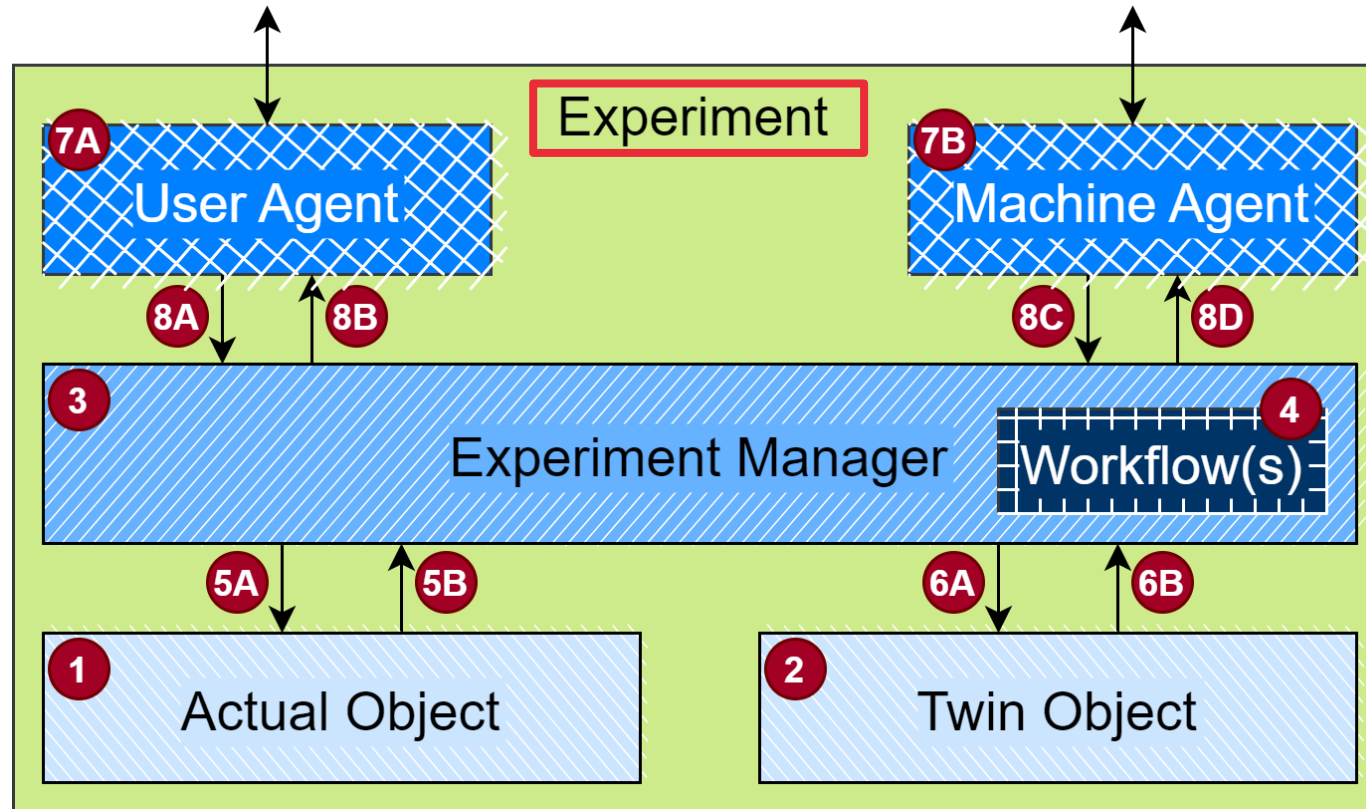


Conceptual Architecture(s)



presence conditions
to capture variability

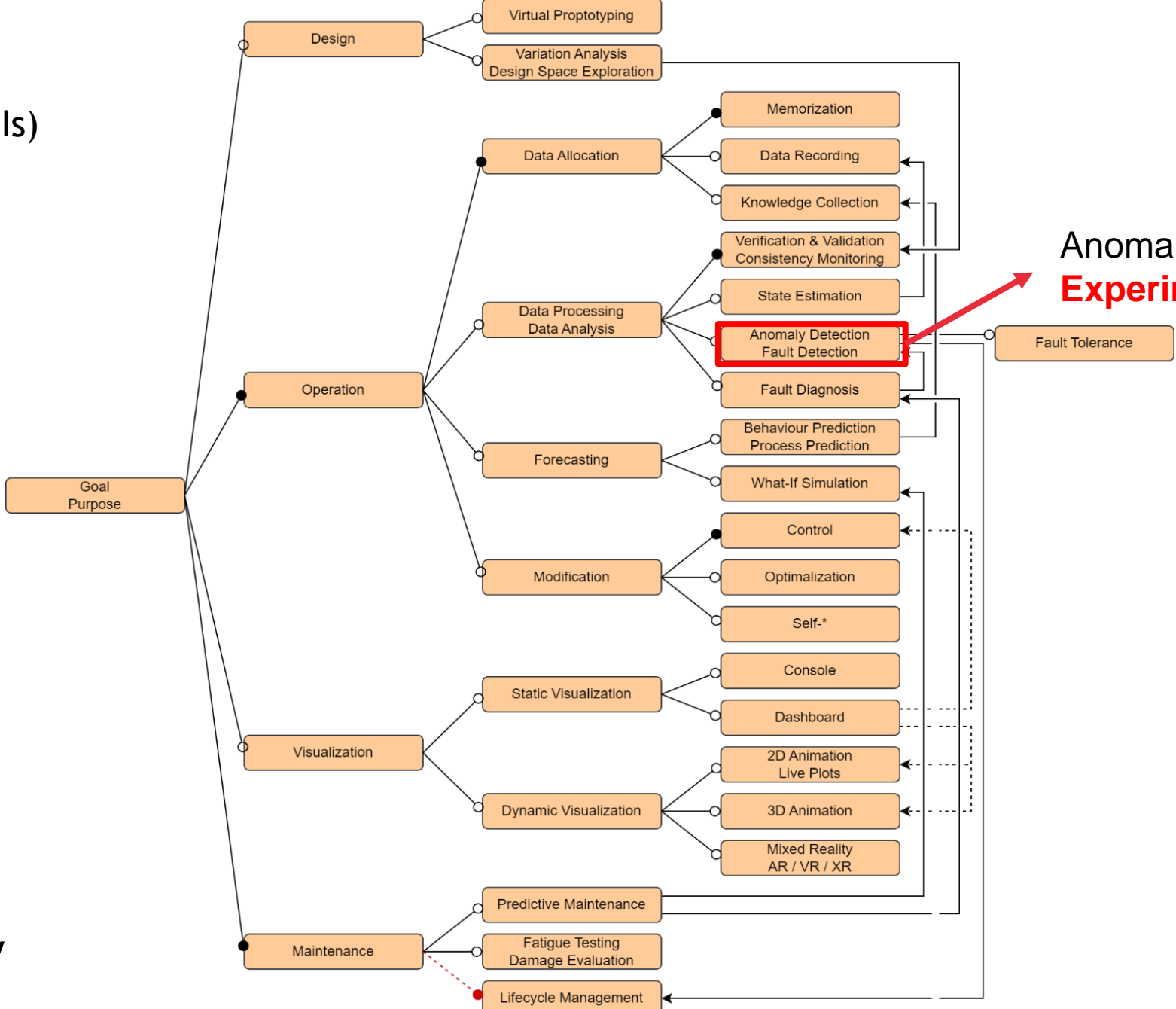
Conceptual Architecture(s)



presence conditions
to capture variability

An **experiment** is an intentional set of (possibly hierarchically composed) activities, carried out on a specific SuS in order to accomplish a specific set of goals.

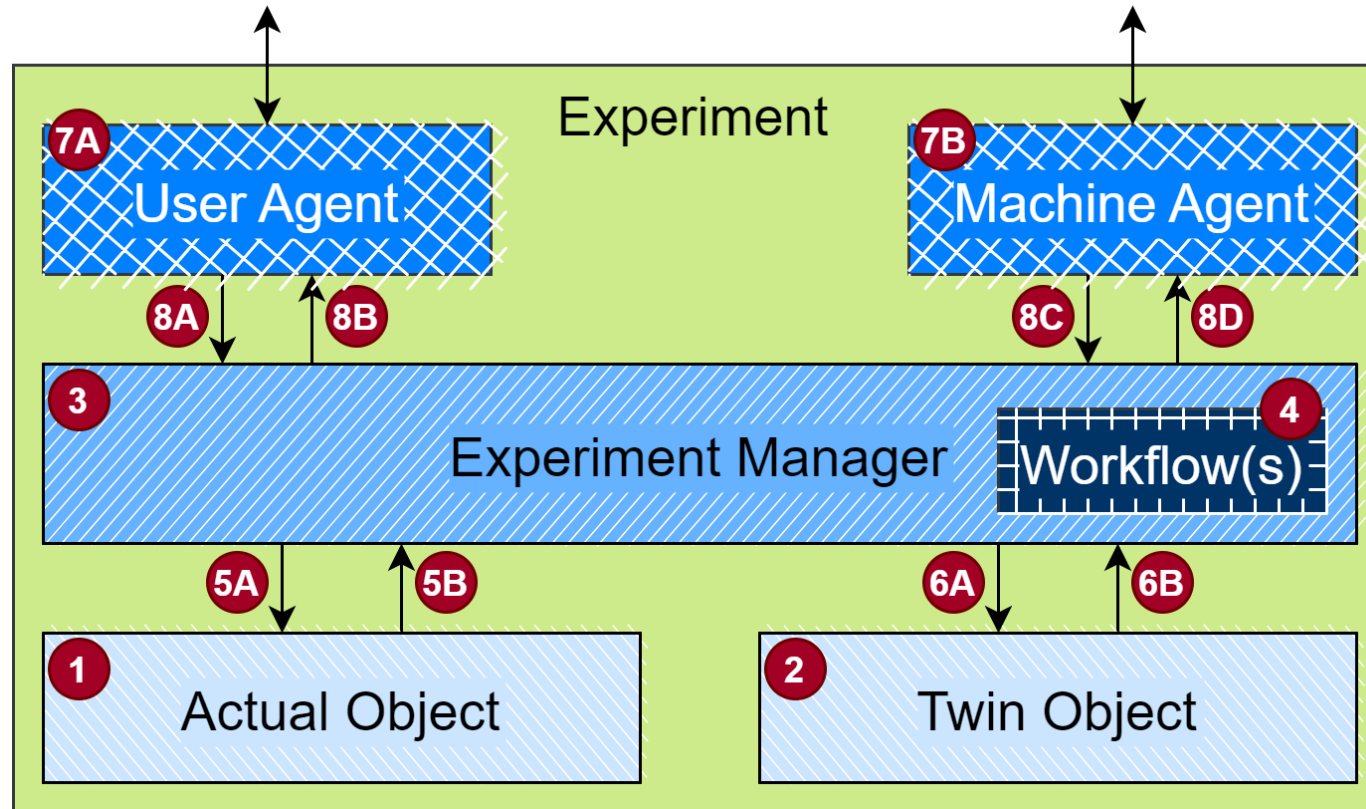
Goals w.r.t. their Properties of Interest (Pols)



Anomaly Detection Experiment

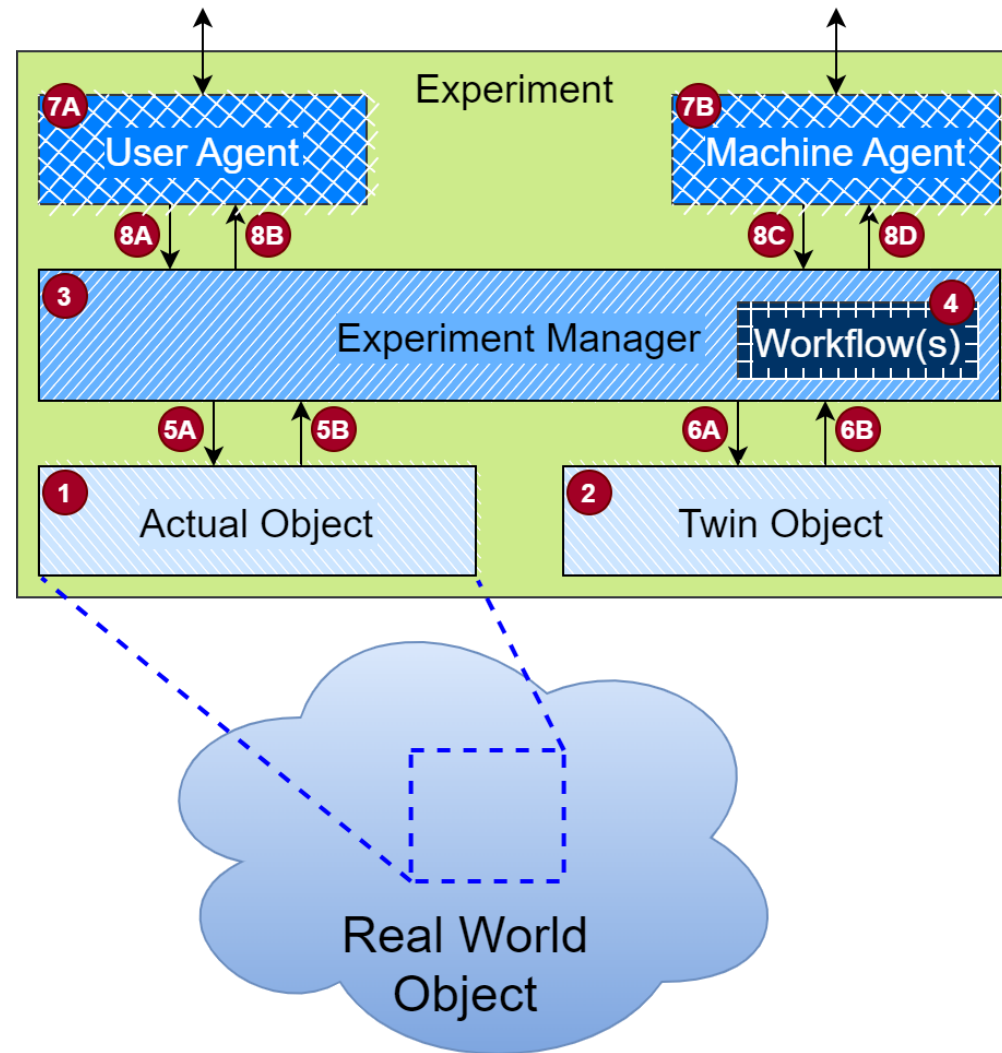
“feature model” to capture variability

Conceptual Architecture(s)



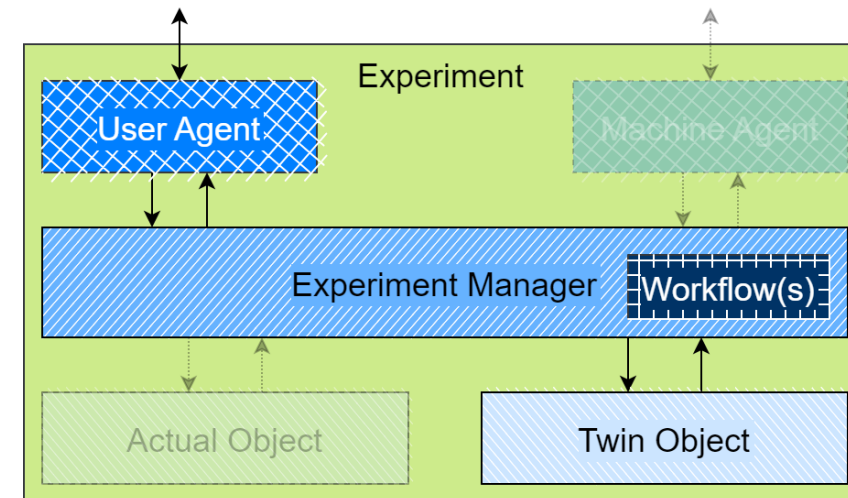
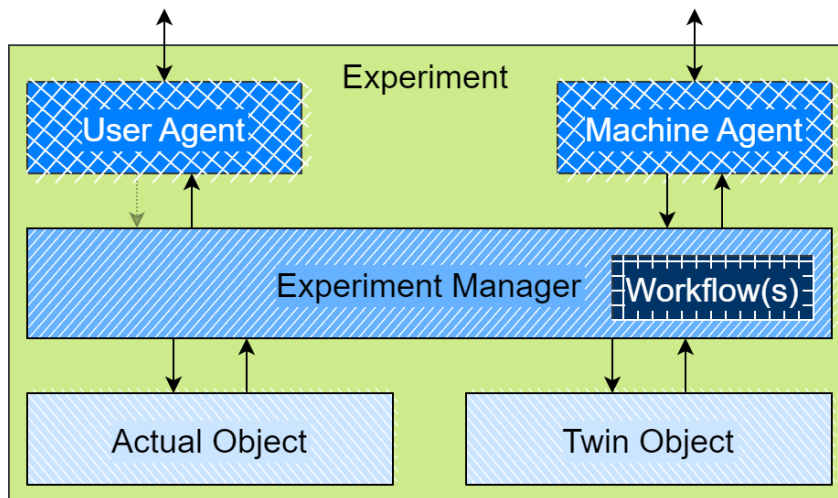
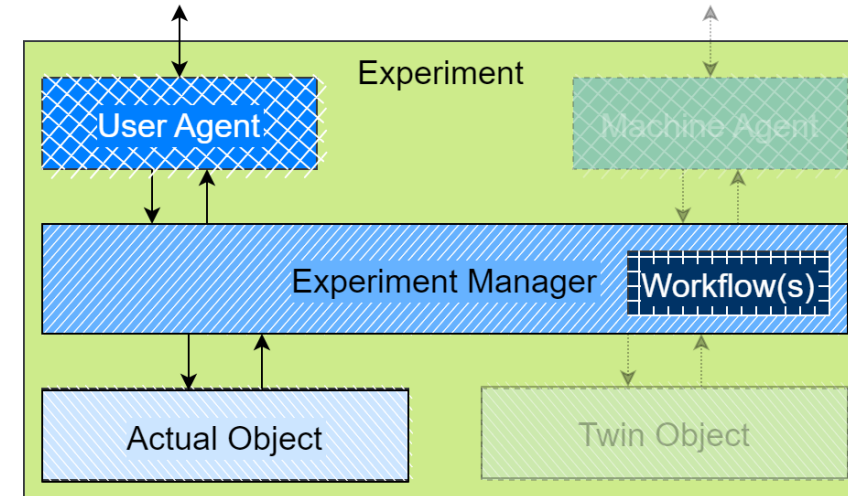
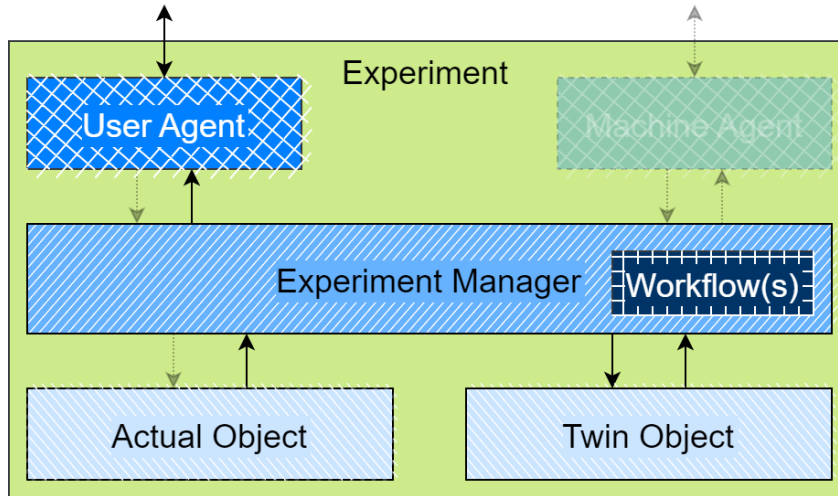
presence conditions
to capture variability

Conceptual Architecture(s)

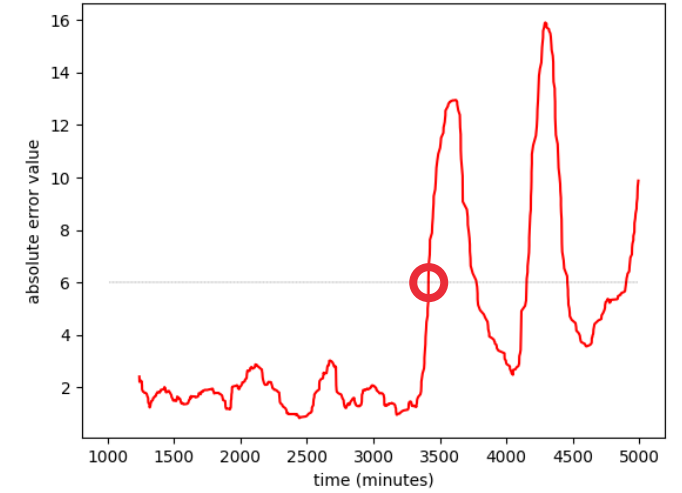
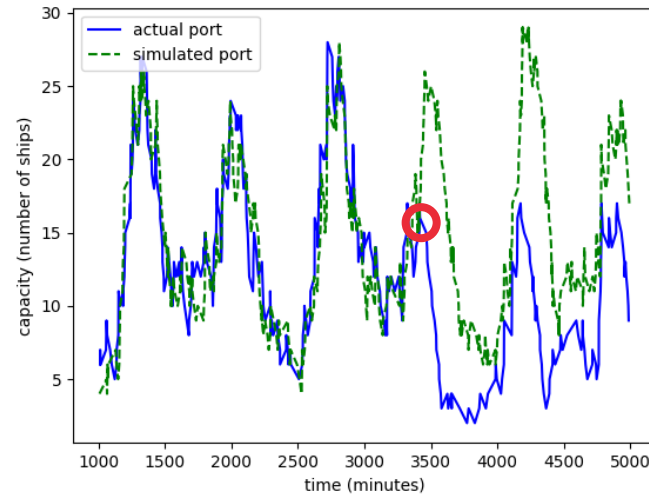
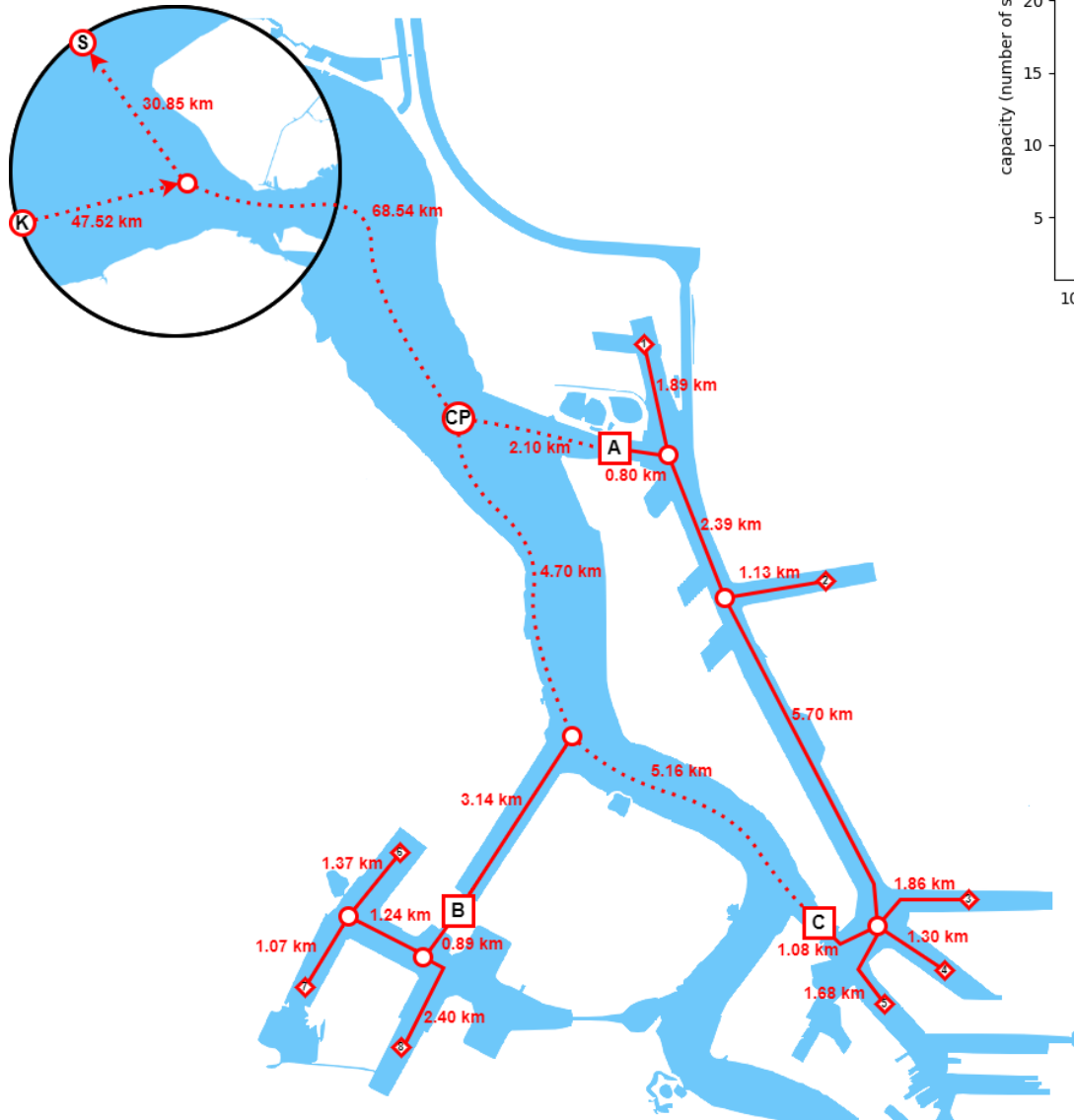


presence conditions
to capture variability

Conceptual Architecture Example(s)

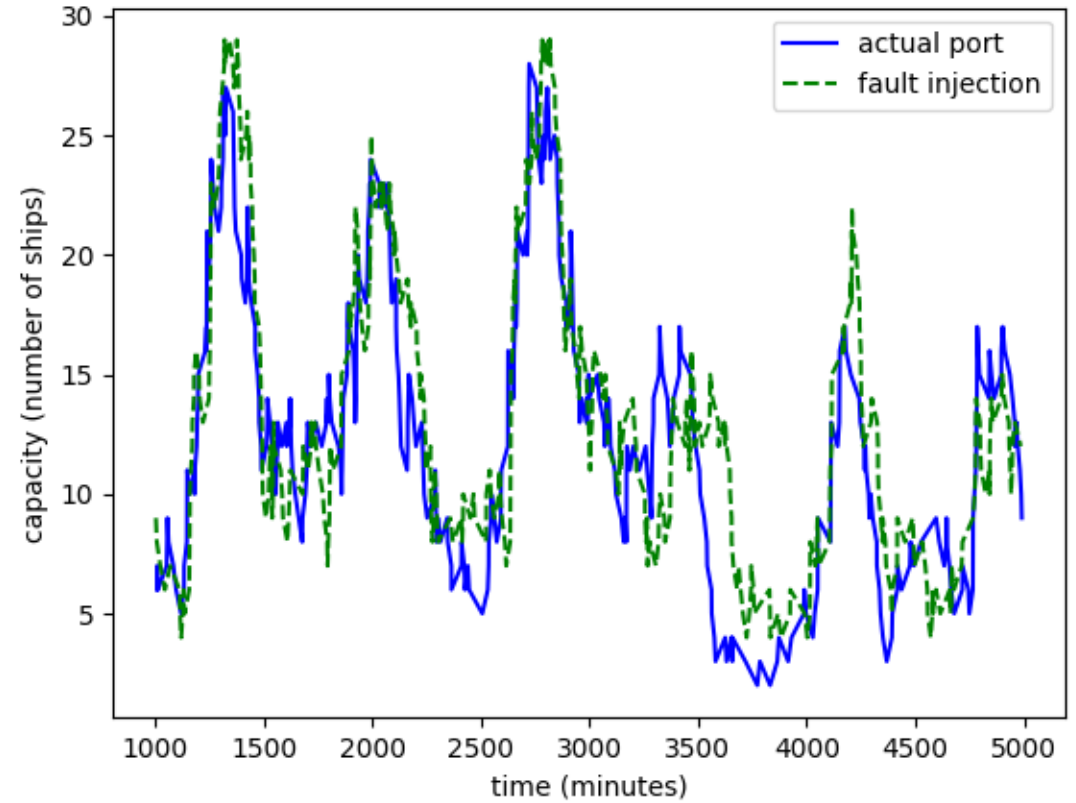
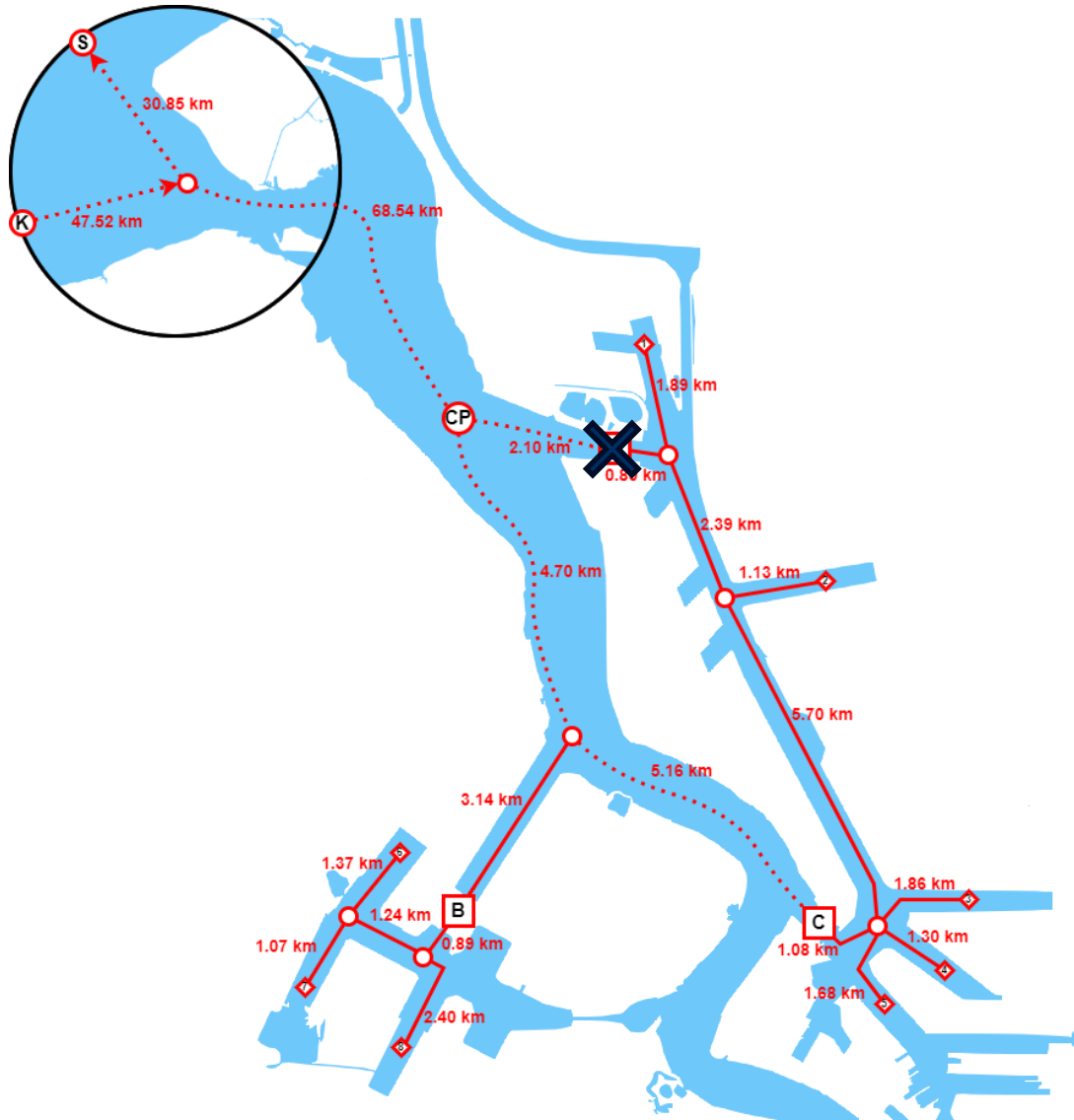


Proof-of-Concept: Port of Antwerp

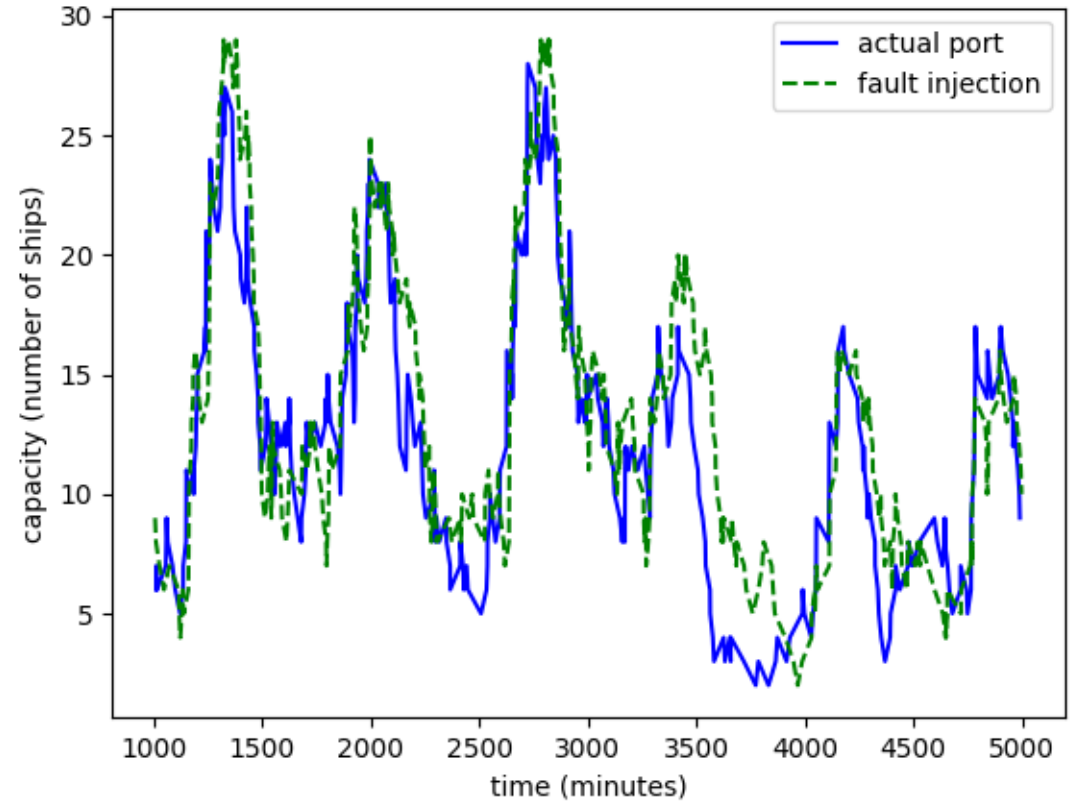
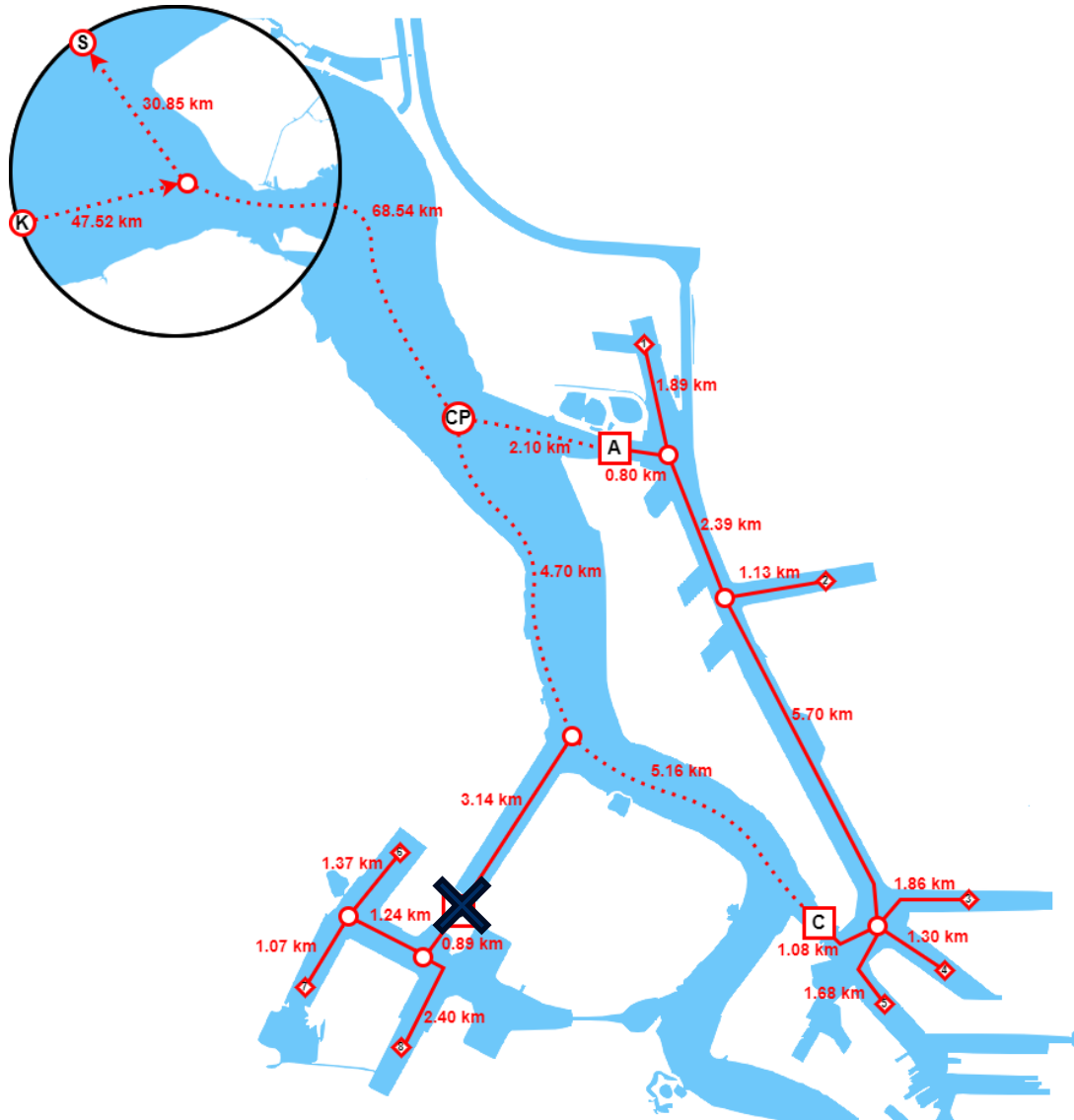


$D \leftarrow$ Drop-off value for the error.
 $M \leftarrow$ Maximal allowed time above D .
 $prev \leftarrow -1$
while system is running **do**
 $cap_A \leftarrow$ Capacity value of the AO.
 $cap_T \leftarrow$ Capacity value of the TO.
 $T \leftarrow$ Current execution time.
 $error \leftarrow |cap_A - cap_T|$
 if $prev > 0$ and $T - prev > M$ **then**
 Raise an anomaly.
 end if
 if $error > D$ **then**
 if $prev < 0$ **then**
 $prev \leftarrow T$
 end if
 else
 $prev \leftarrow -1$
 end if
end while

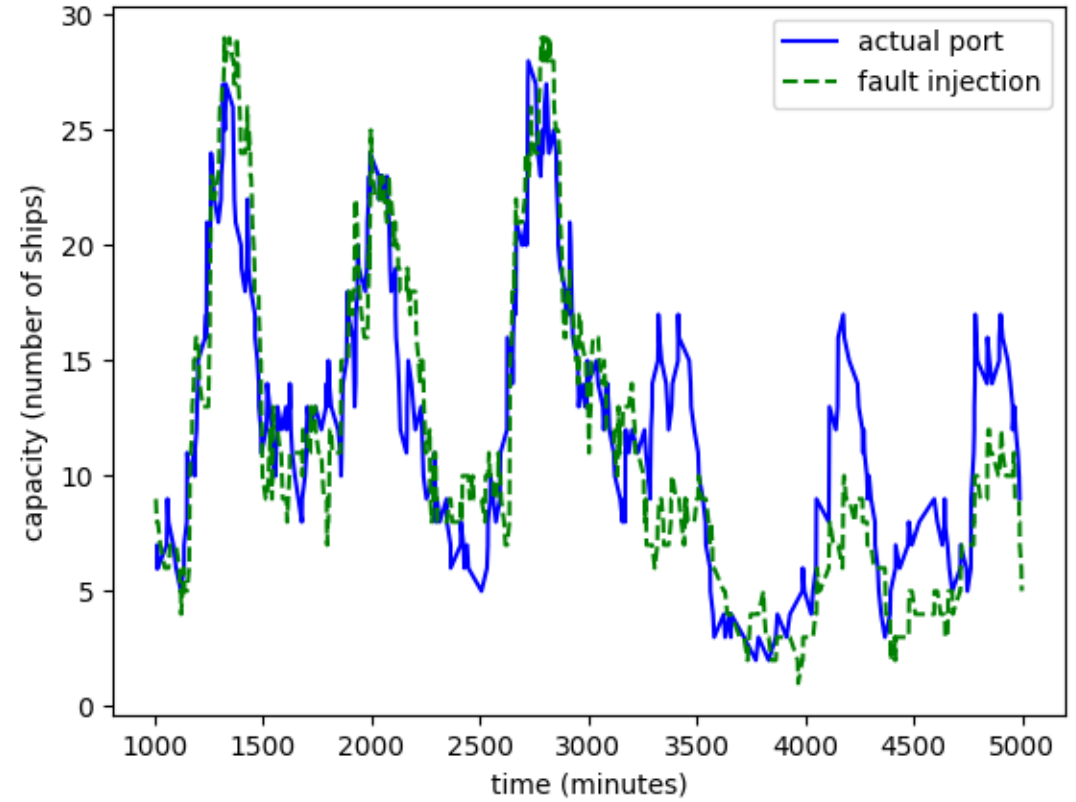
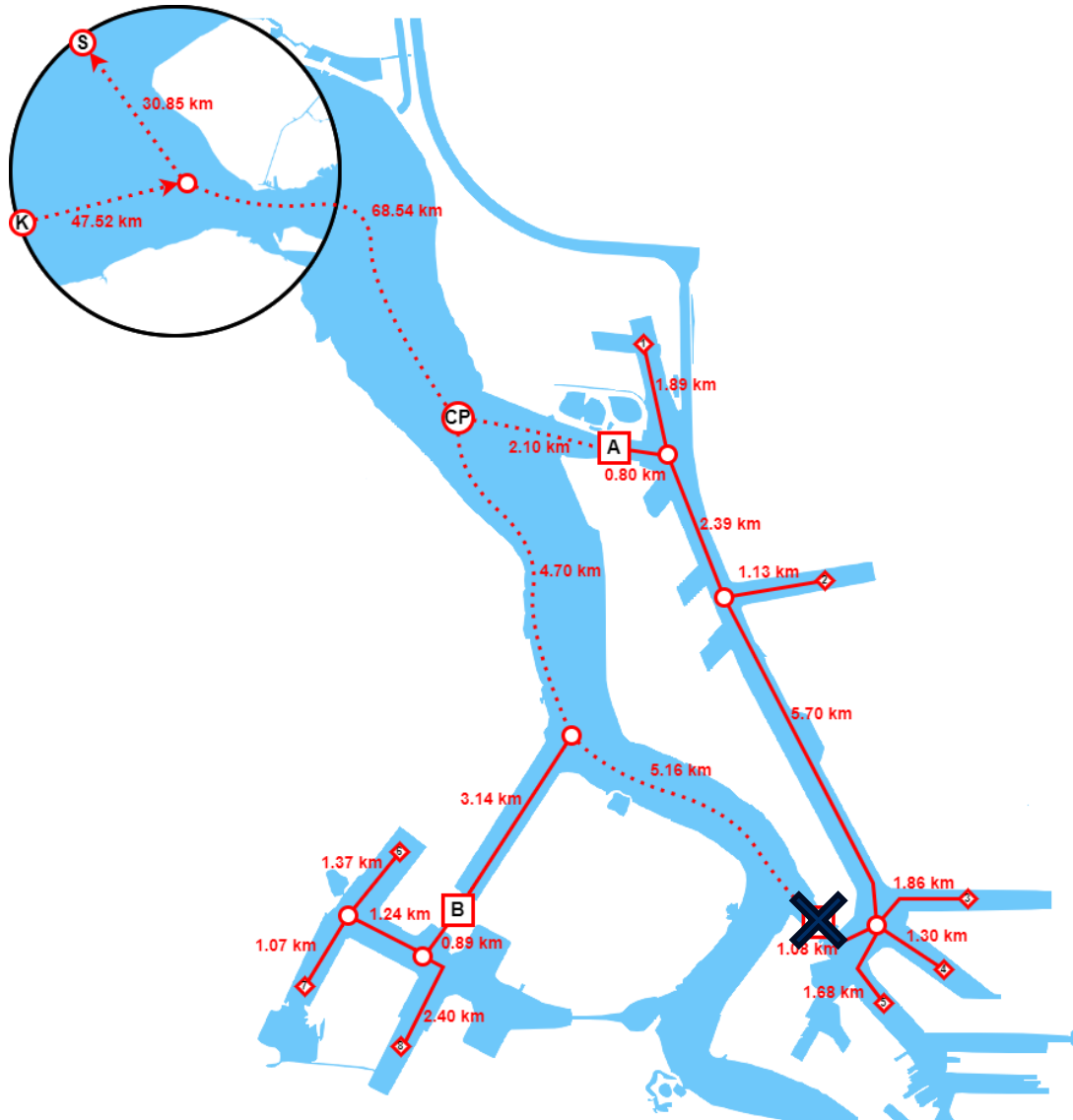
Proof-of-Concept: Port of Antwerp



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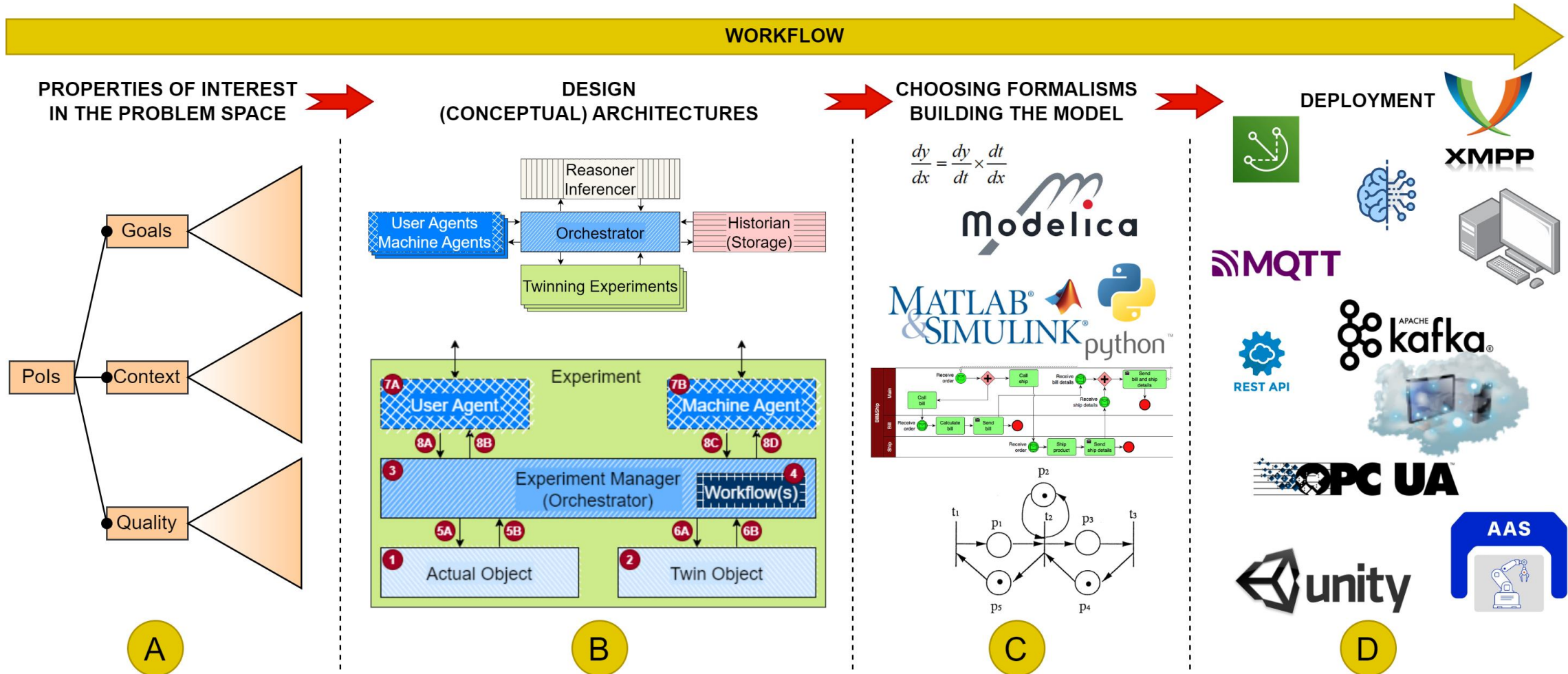
Proof-of-Concept: Port of Antwerp



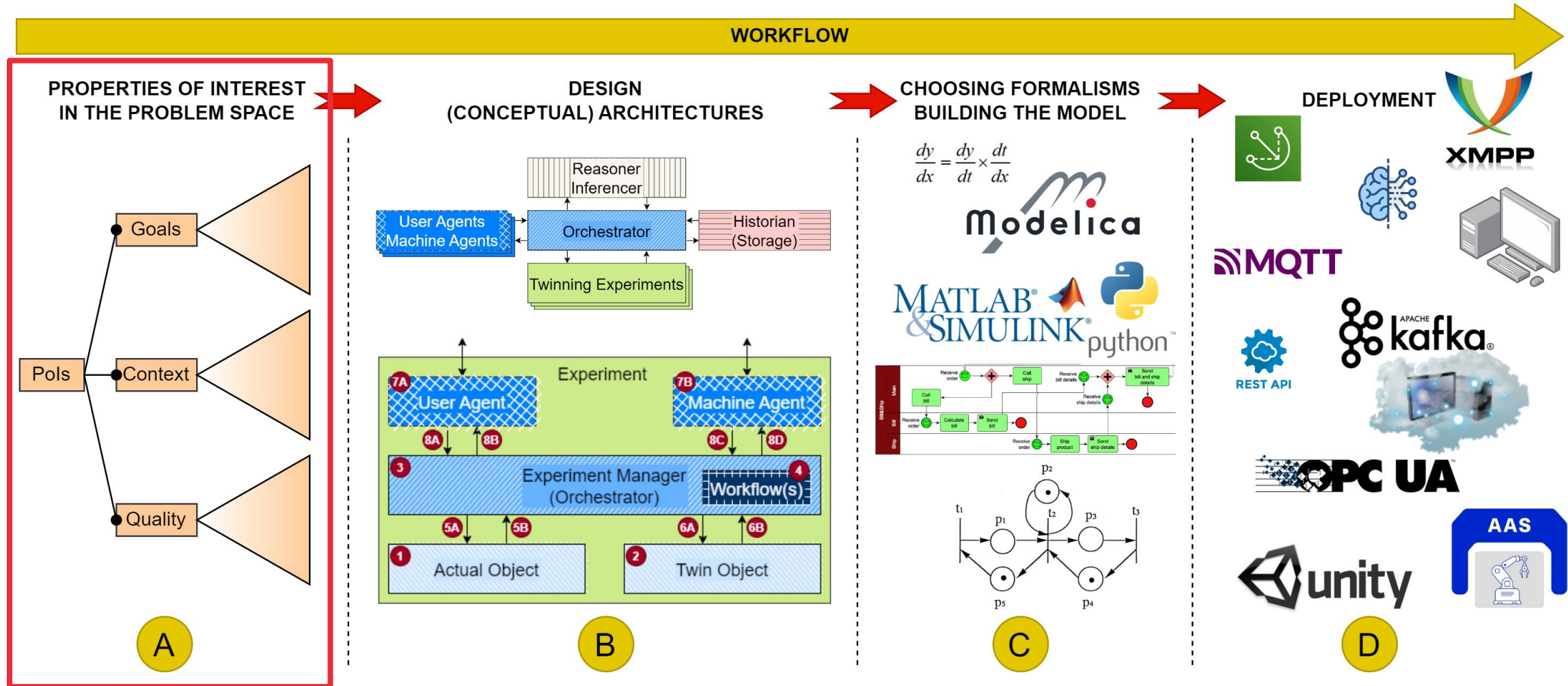
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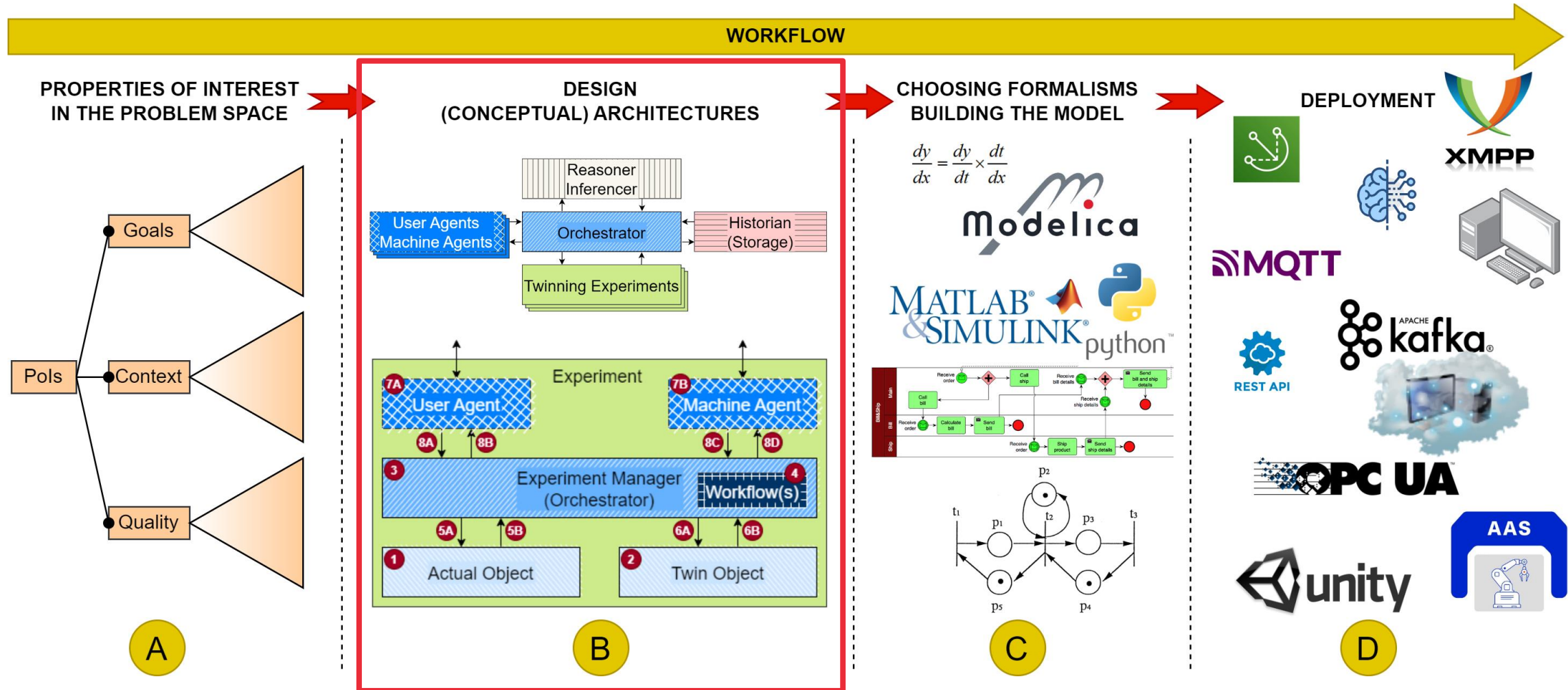
Stages of Twinning Variability (main contribution)



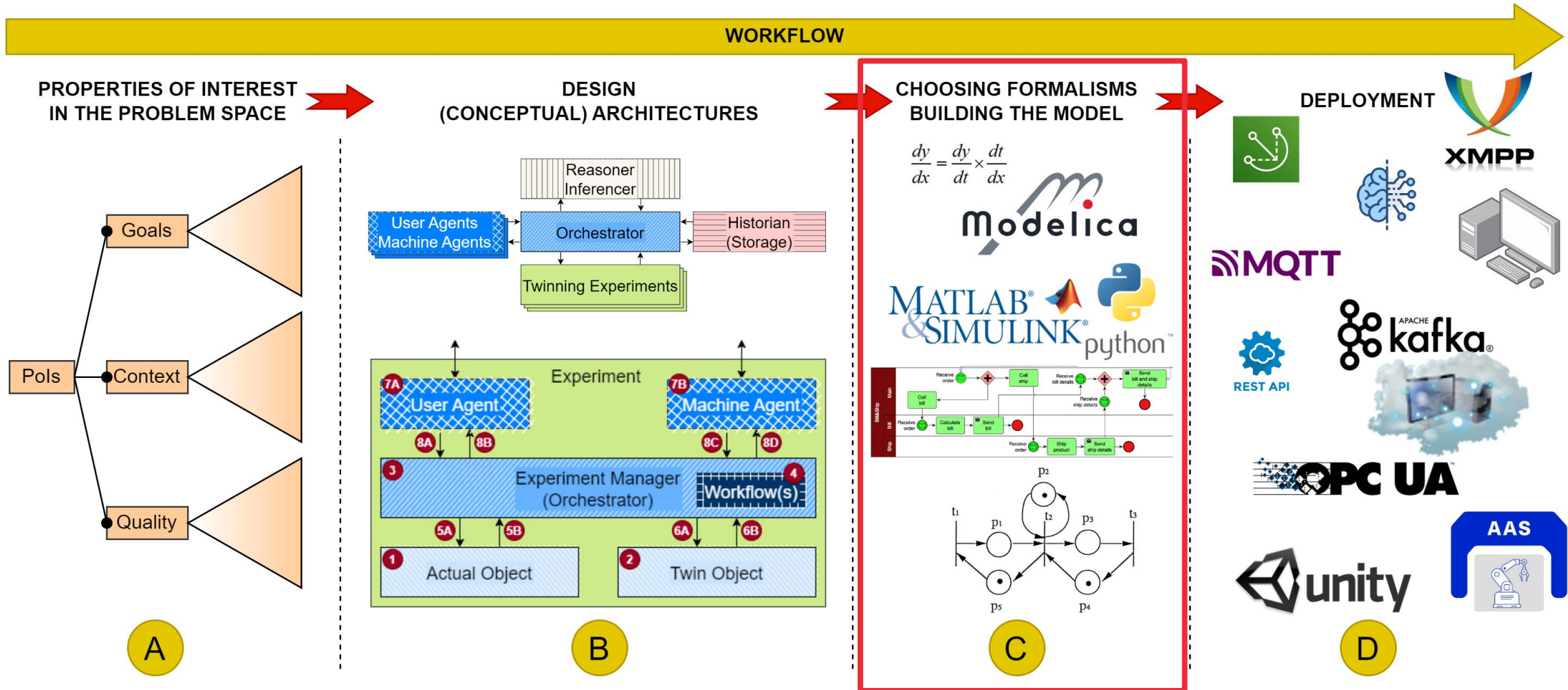
Stages of Twinning Variability – The Problem Space



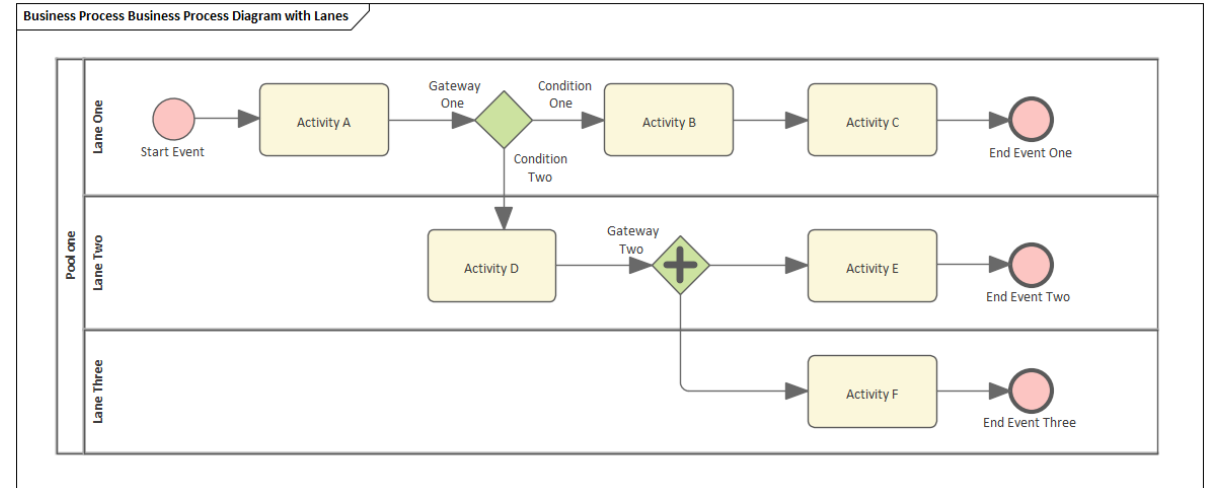
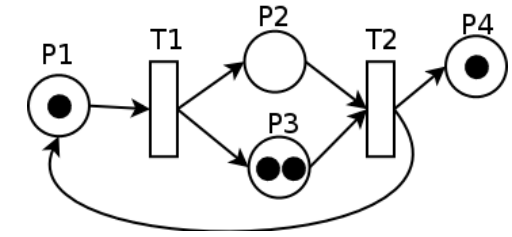
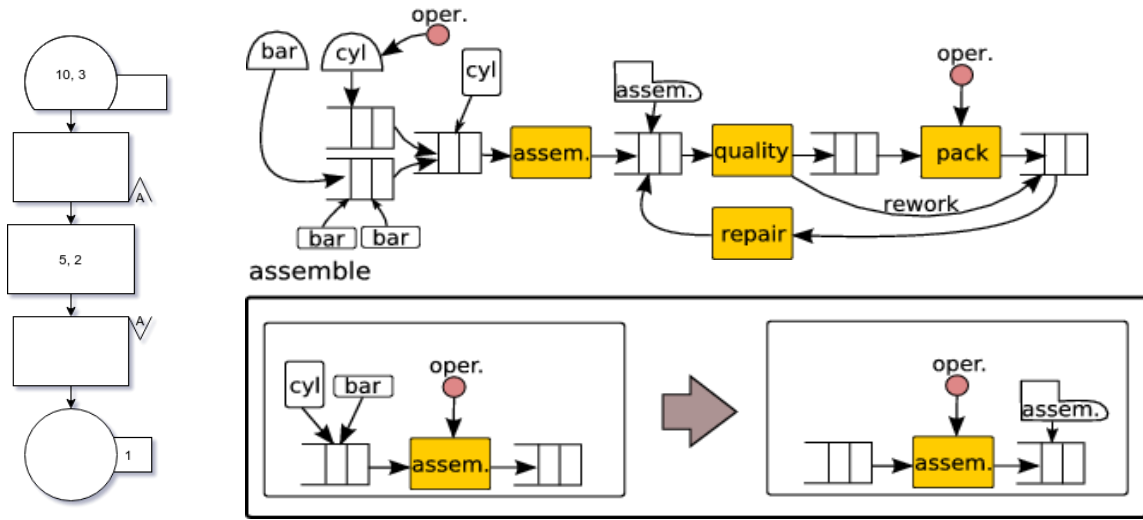
Stages of Twinning Variability – Architectures



Stages of Twinning Variability – Modelling



MPM: Using the most appropriate...



1. for $\{0 \leq z \leq z_f - \sigma\}$:

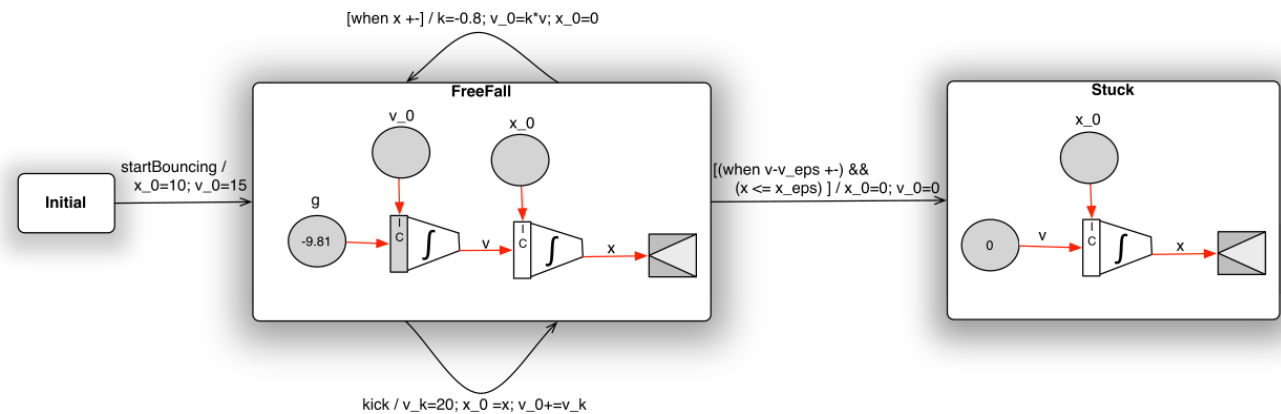
$$\frac{\partial X(z,t)}{\partial t} = - \left[(1 - nX(z,t)) v_0 e^{-nX(z,t)} + \frac{Q_u(t)}{A} \right] \frac{\partial X(z,t)}{\partial z} + D_0 \frac{\partial^2 X(z,t)}{\partial z^2};$$

2. for $\{z_f - \sigma < z < z_f + \sigma\}$:

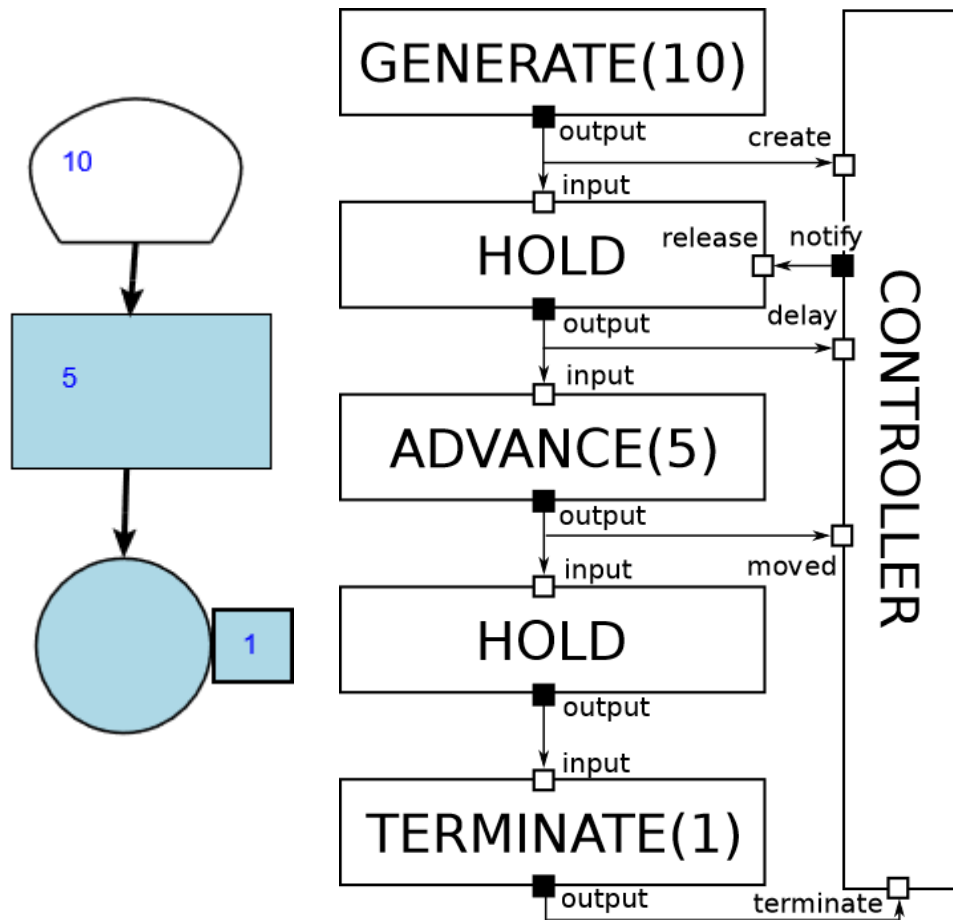
$$\frac{\partial X(z,t)}{\partial t} = - \left[(1 - nX(z,t)) v_0 e^{-nX(z,t)} + \frac{Q_u(t)}{A} \right] \frac{\partial X(z,t)}{\partial z} + X_f(t) \frac{Q_f(t)}{A} \frac{1}{2\sigma} + D_0 \frac{\partial^2 X(z,t)}{\partial z^2};$$

3. for $\{z_f + \sigma \leq z \leq L\}$:

$$\frac{\partial X(z,t)}{\partial t} = - \left[(1 - nX(z,t)) v_0 e^{-nX(z,t)} + \frac{Q_u(t)}{A} \right] \frac{\partial X(z,t)}{\partial z} + D_0 \frac{\partial^2 X(z,t)}{\partial z^2}.$$



MPM: sGPSS to Python(P)DEVS (master's thesis)



```

from pypdevs.DEVS import CoupledDEVS
from pypdevsbb1.domain.gpss import Transaction, Hold, Controller, dist
from pypdevsbb1.domain.gpss import ADVANCE, TERMINATE
from pypdevsbb1.generic.generators import RandomDelayGenerator as GENERATE

class Model(CoupledDEVS):
    def __init__(self):
        super().__init__("Model")

        self.GPSS2DEVS_2_Controller = self.addSubModel(Controller("GPSS2DEVS_2_Controller"))

        self.GPSS2DEVS_0_L0 = self.addSubModel(GENERATE("GPSS2DEVS_0_L0", dist=dist, args=(10,),
                                                    func=lambda x, t: Transaction(x, t), dt=None))

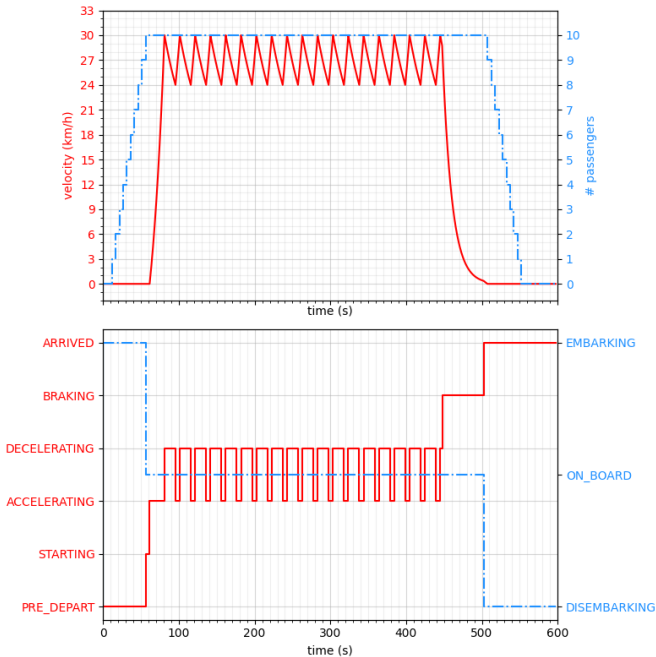
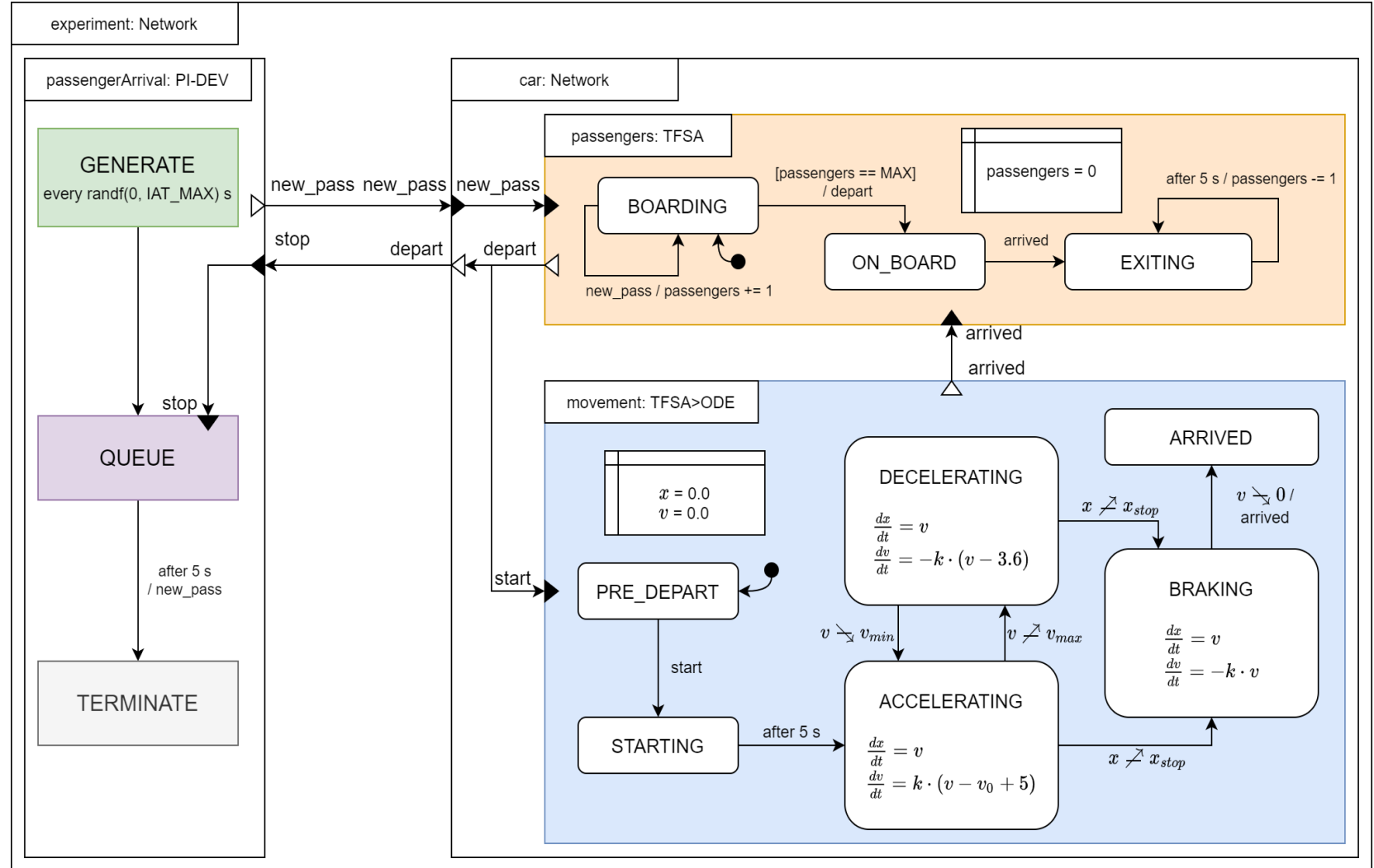
        self.GPSS2DEVS_4_L0 = self.addSubModel(Hold("GPSS2DEVS_4_L0"))
        self.connectPorts(self.GPSS2DEVS_0_L0.output, self.GPSS2DEVS_4_L0.input)
        self.connectPorts(self.GPSS2DEVS_0_L0.output, self.GPSS2DEVS_2_Controller.create)
        self.connectPorts(self.GPSS2DEVS_2_Controller.broadcast, self.GPSS2DEVS_4_L0.release)

        self.GPSS2DEVS_1_L1 = self.addSubModel(ADVANCE("GPSS2DEVS_1_L1", dist=dist, args=(5,)))
        self.GPSS2DEVS_4_L1 = self.addSubModel(Hold("GPSS2DEVS_4_L1"))
        self.connectPorts(self.GPSS2DEVS_1_L1.output, self.GPSS2DEVS_4_L1.input)
        self.connectPorts(self.GPSS2DEVS_4_L0.output, self.GPSS2DEVS_2_Controller.delay)
        self.connectPorts(self.GPSS2DEVS_4_L1.output, self.GPSS2DEVS_2_Controller.moved)
        self.connectPorts(self.GPSS2DEVS_2_Controller.pause, self.GPSS2DEVS_1_L1.pause)
        self.connectPorts(self.GPSS2DEVS_2_Controller.broadcast, self.GPSS2DEVS_4_L1.release)

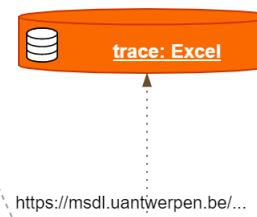
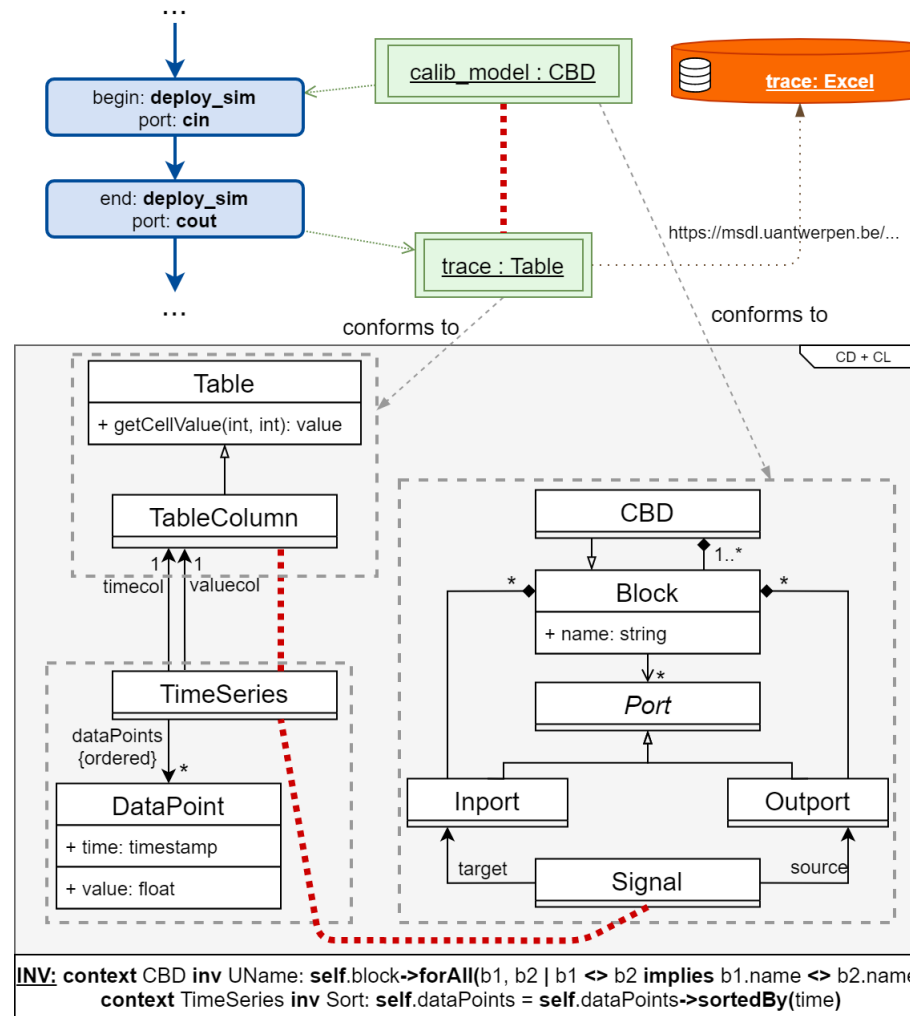
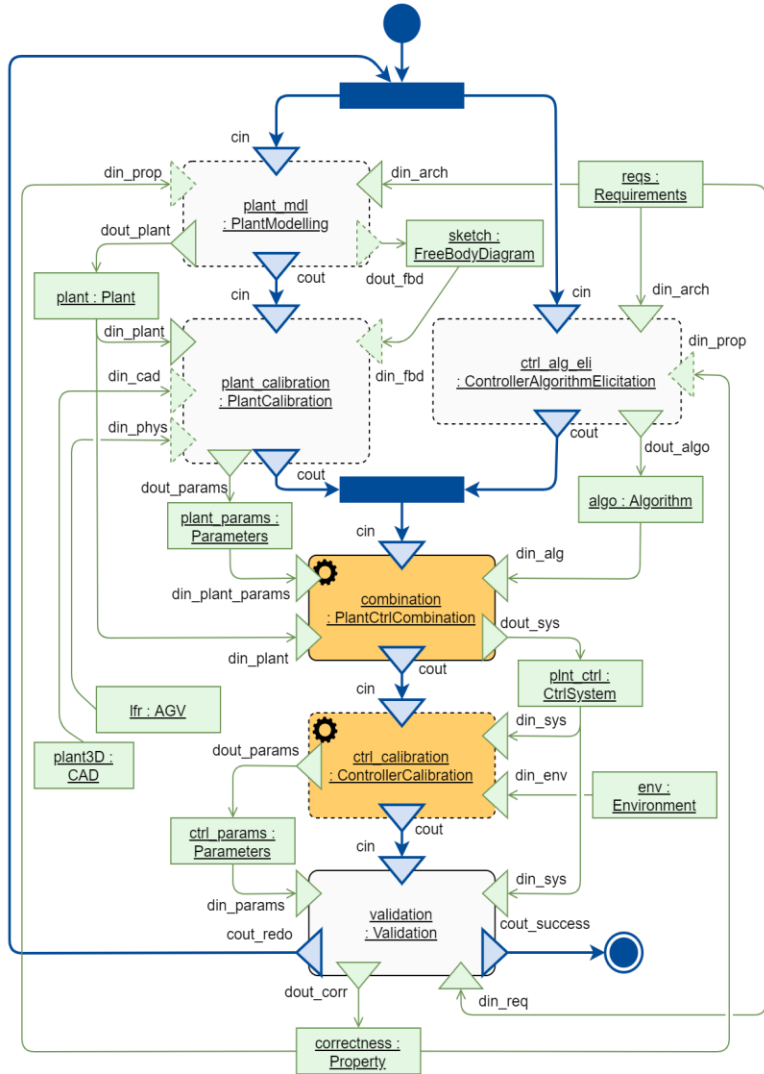
        self.GPSS2DEVS_5_L2 = self.addSubModel(TERMINATE("GPSS2DEVS_5_L2", '1'))
        self.connectPorts(self.GPSS2DEVS_5_L2.output, self.GPSS2DEVS_2_Controller.terminate)

        self.connectPorts(self.GPSS2DEVS_4_L0.output, self.GPSS2DEVS_1_L1.input)
        self.connectPorts(self.GPSS2DEVS_4_L1.output, self.GPSS2DEVS_5_L2.input)
    
```

MPM: PI-DEV+TFSA > (ODE+StEL) to DEVS

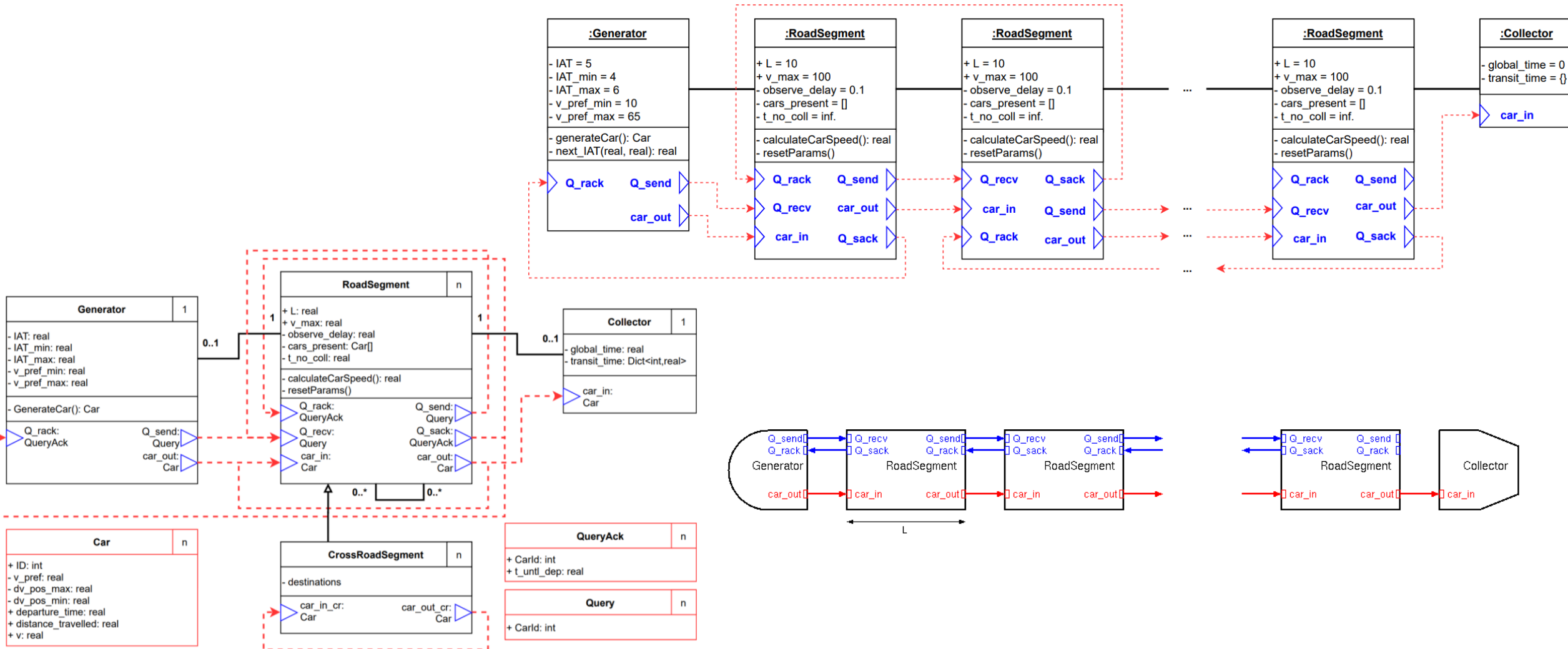


MPM: Extending the FTG+PM

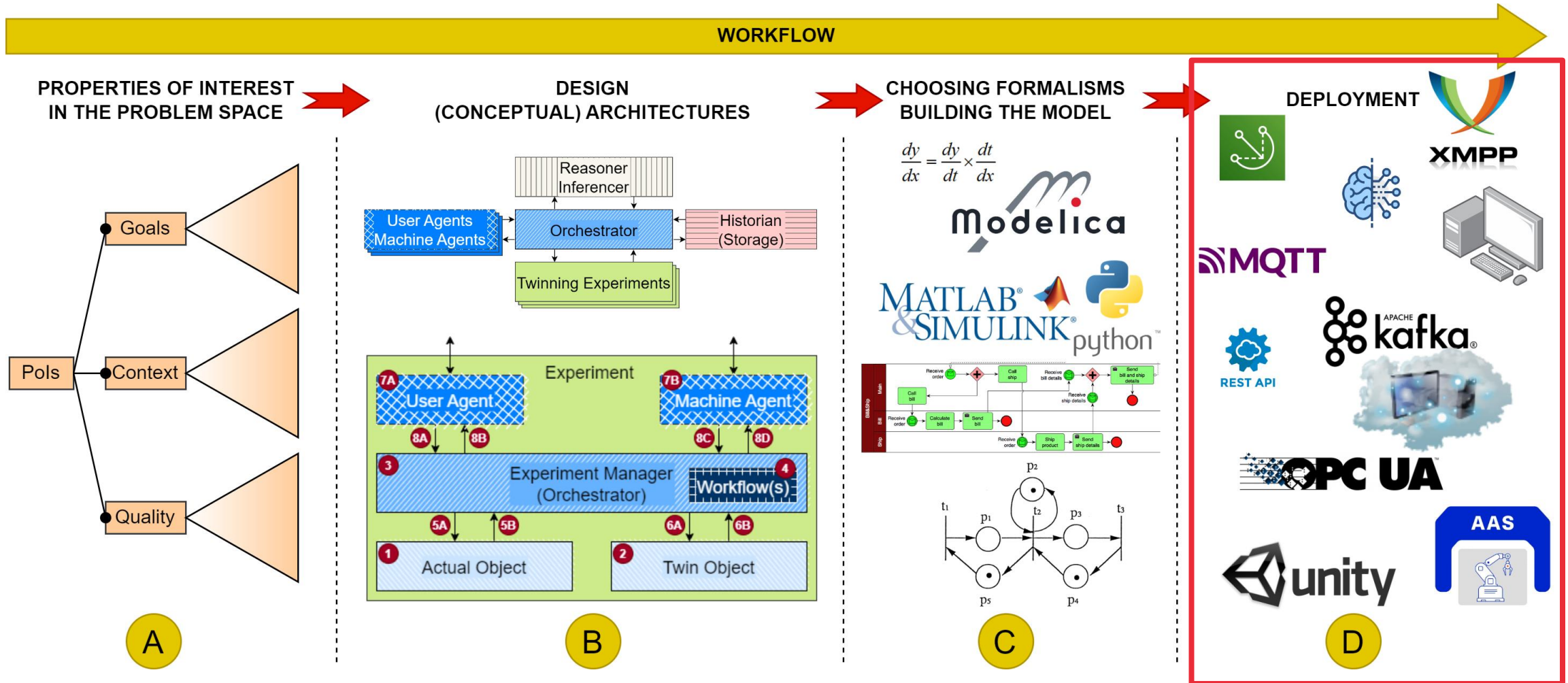


	A	B	C	D
1	time	x	y	heading
596	118.8	0.215843	-0.29999	0.677788
597	119	0.216126	-0.29976	1.302247
598	119.2	0.216222	-0.29941	1.599066
599	119.4	0.216212	-0.29904	1.46084
600	119.6	0.216252	-0.29868	1.124072
601	119.8	0.216409	-0.29836	0.877111
602	120	0.216641	-0.29808	0.865045
603	120.2	0.216877	-0.2978	1.027622
604	120.4	0.217065	-0.29749	1.198563
605	120.6	0.217197	-0.29715	1.255207
606	120.8	0.21731	-0.2968	1.190118
607	121	0.217445	-0.29647	1.084936
608	121.2	0.217614	-0.29615	1.025846
609	121.4	0.217803	-0.29583	1.041682
610	121.6	0.217986	-0.29552	1.099589
611	121.8	0.218151	-0.2952	1.146234
612	122	0.218301	-0.29487	1.151624
613	122.2	0.218449	-0.29453	1.123763
614	122.4	0.218606	-0.29421	1.092062
615	122.6	0.218773	-0.29388	1.080216
616	122.8	0.218944	-0.29356	1.090973

MPM: CLAVS/ODVS



Stages of Twinning Variability – Deployment

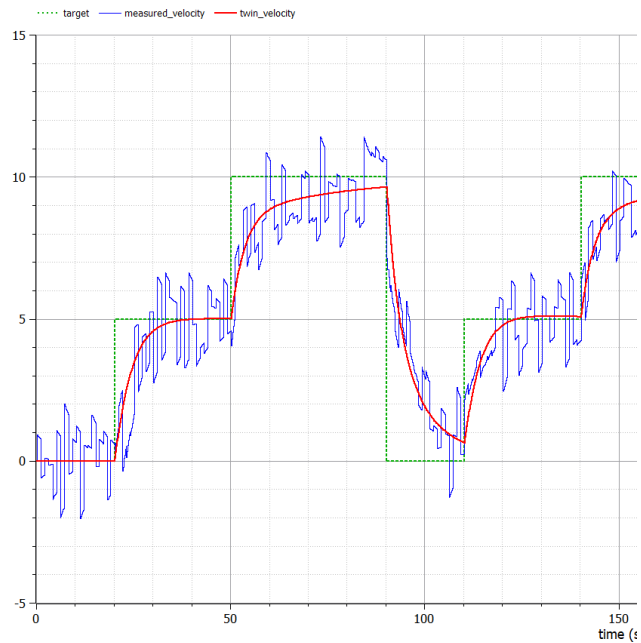


Research Questions

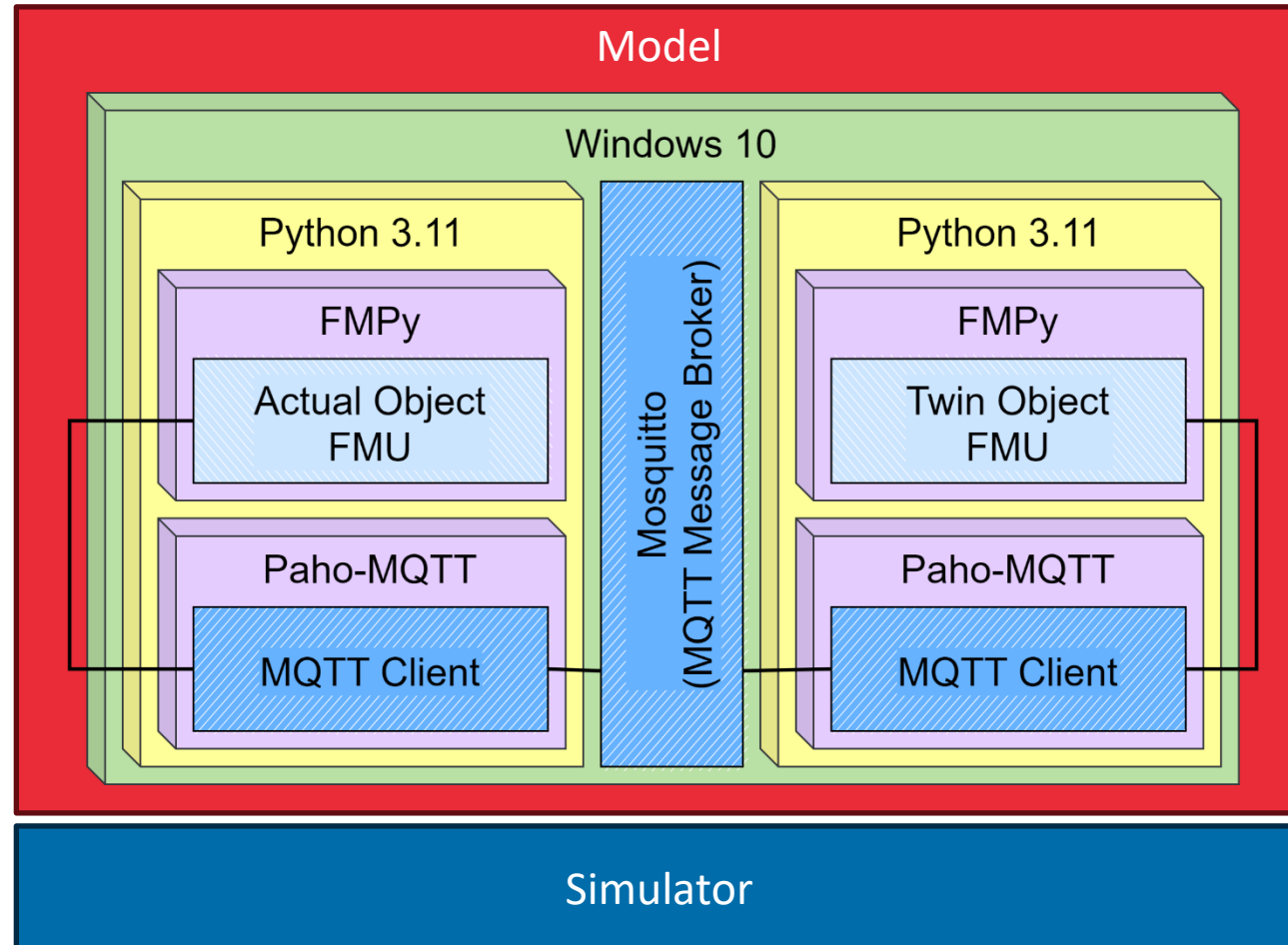
- **RQ1:** *What are the most common reasons/definitions for (creating) Digital Twins (DTs)?*
- **RQ2:** *Given the large number of existing DTs in the literature, can we unify?*
- **RQ3:** *Is there a relationship between specific DT requirements, the system architecture, the used models, and the eventual deployment?*
- **RQ4:** *How to quantitatively support deployment choices?*
- **RQ5:** *How can we conveniently combine multiple DTs into a larger system?*

Proof-of-Concept: 1D Behaviour of a Vessel

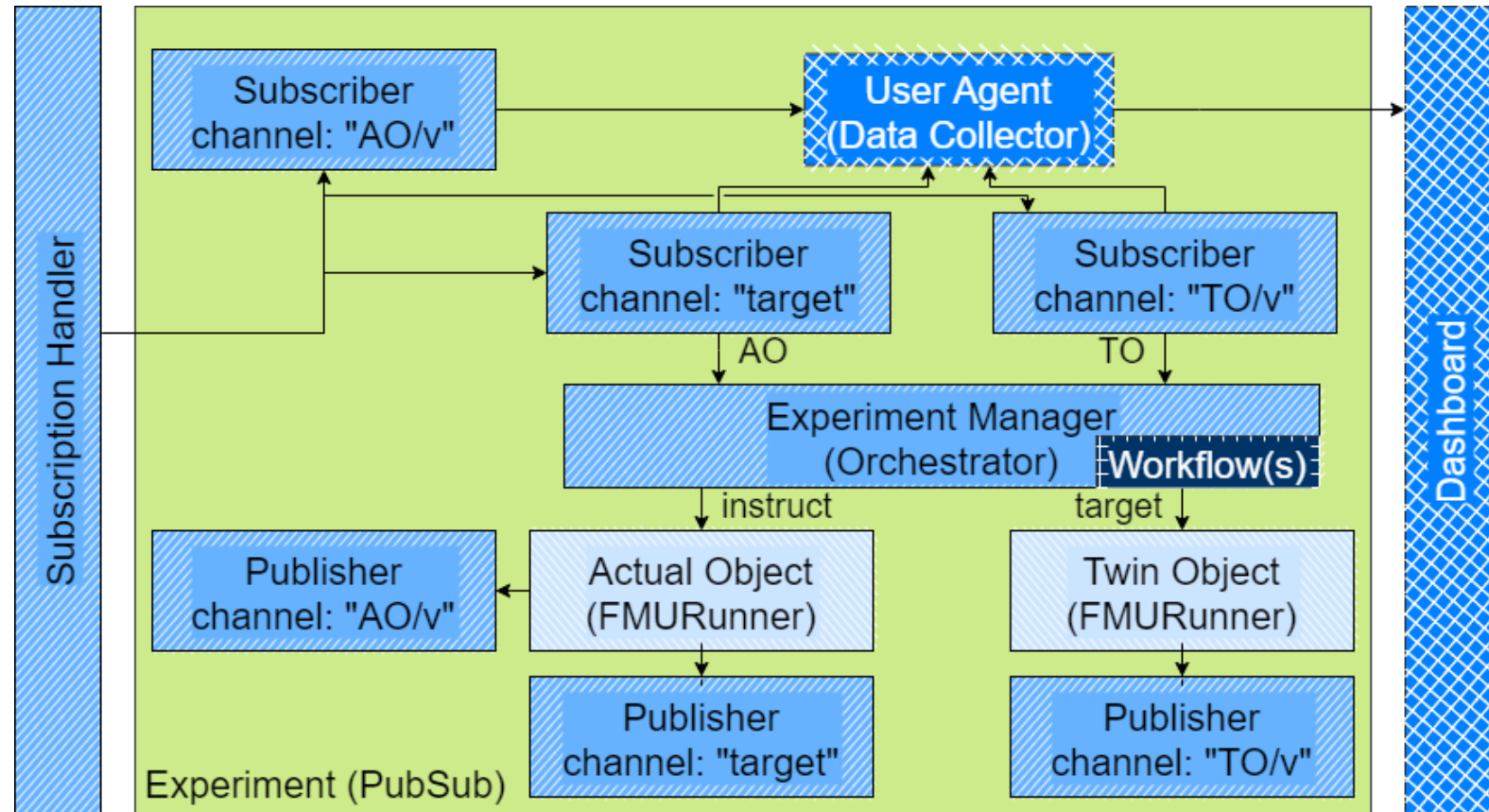
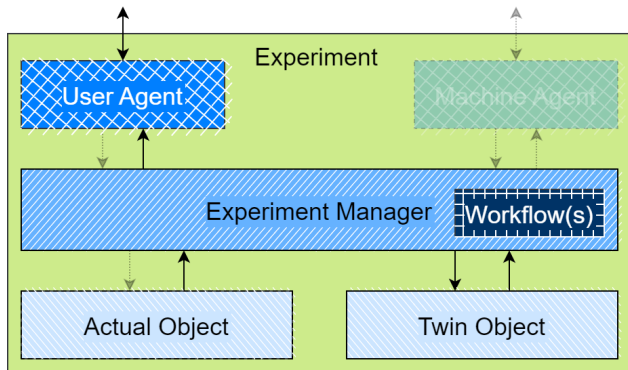
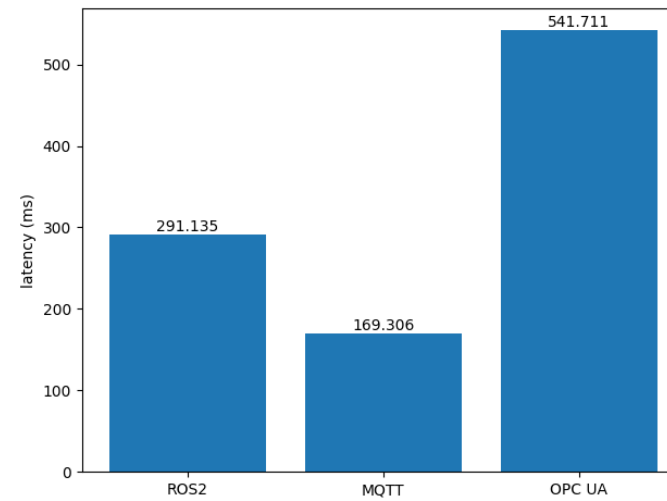
Length = 21.54 m
Dry Mass = 32,000 kg



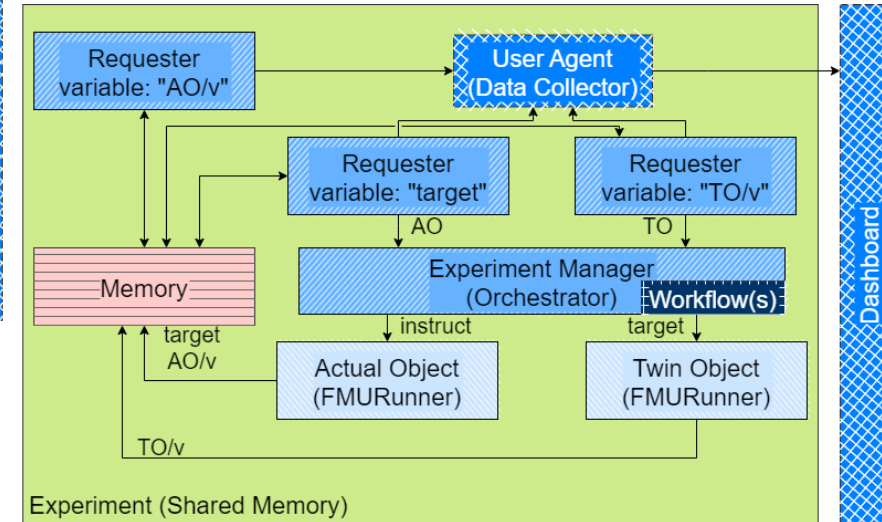
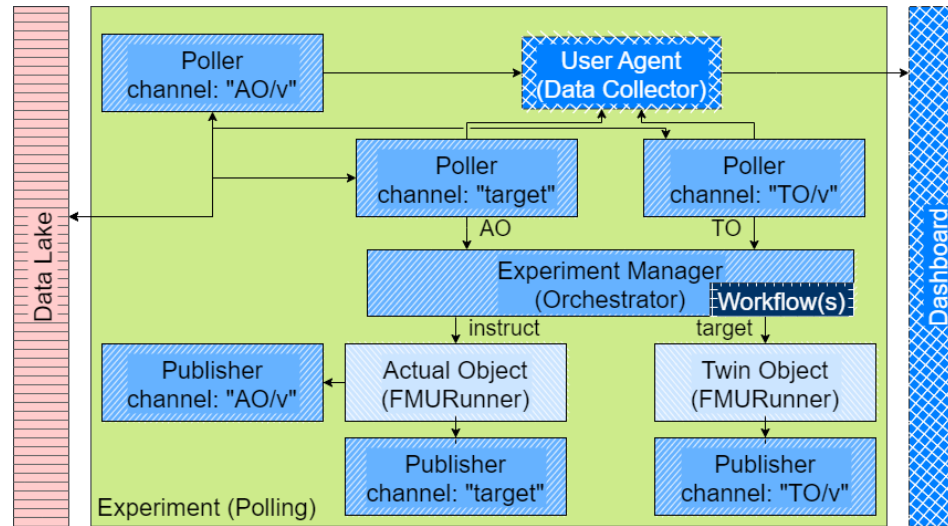
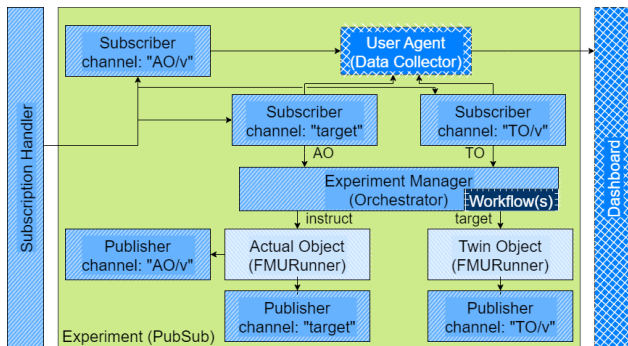
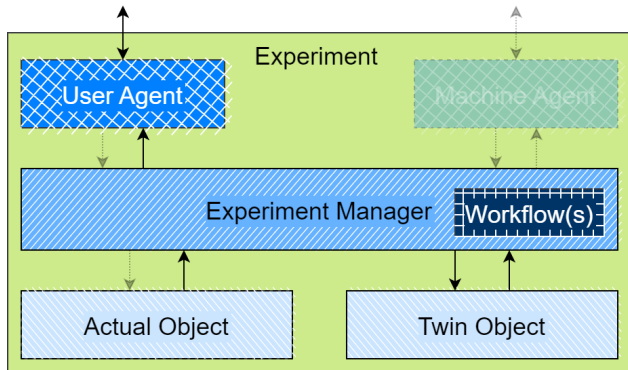
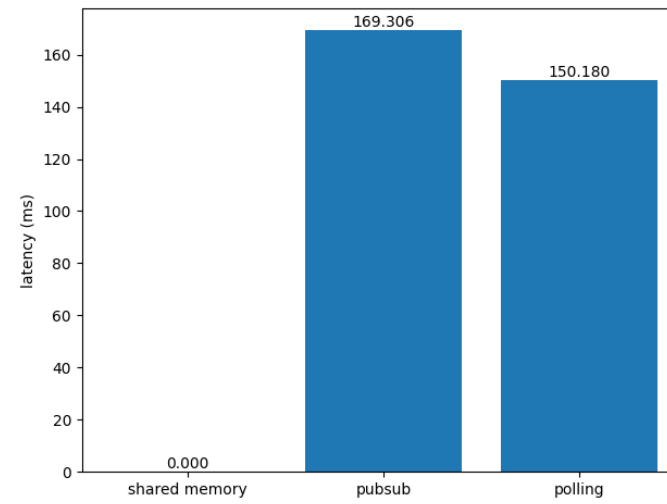
$$\begin{cases} F_R = \frac{1}{2} \cdot \rho \cdot v^2 \cdot S \cdot C_f \\ C_f = \frac{0.075}{(\log_{10}(Re) - 2)^2} \\ Re = \frac{v \cdot L}{k} \end{cases}$$



Proof-of-Concept: 1D Behaviour of a Ship



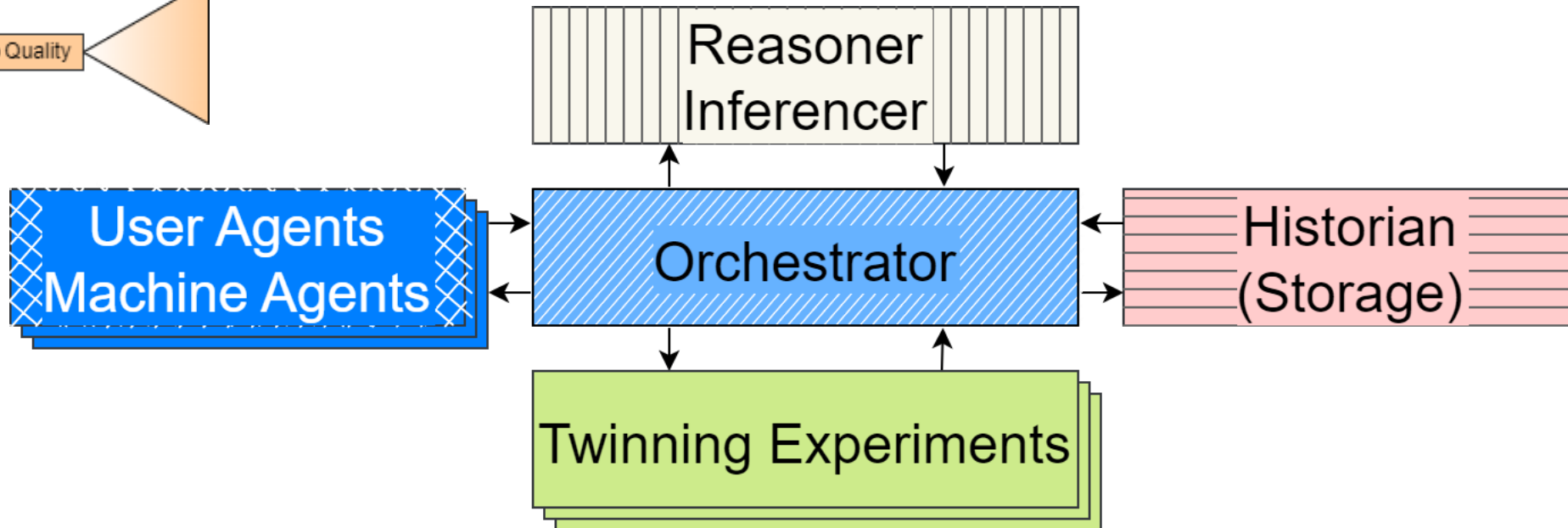
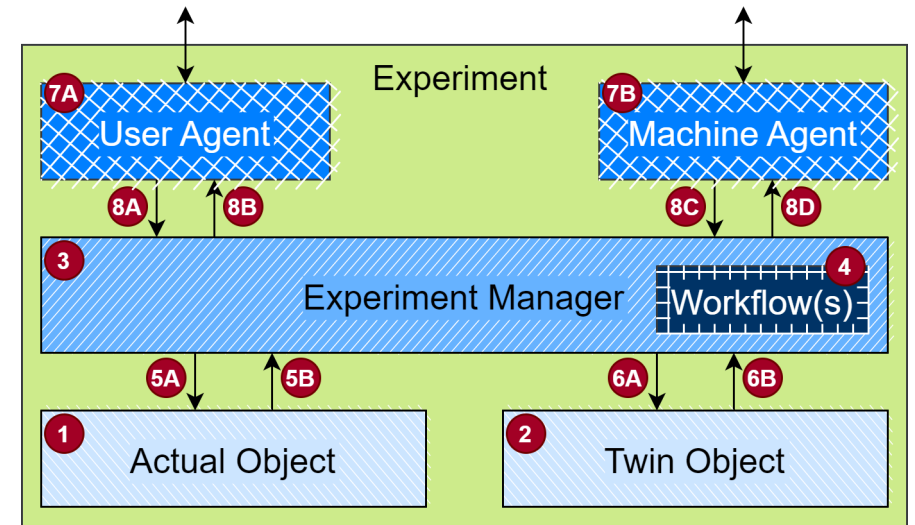
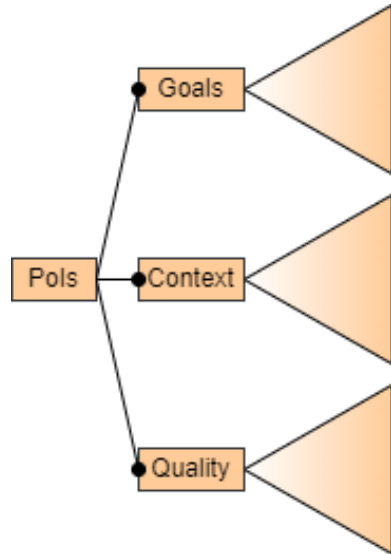
Proof-of-Concept: 1D Behaviour of a Ship



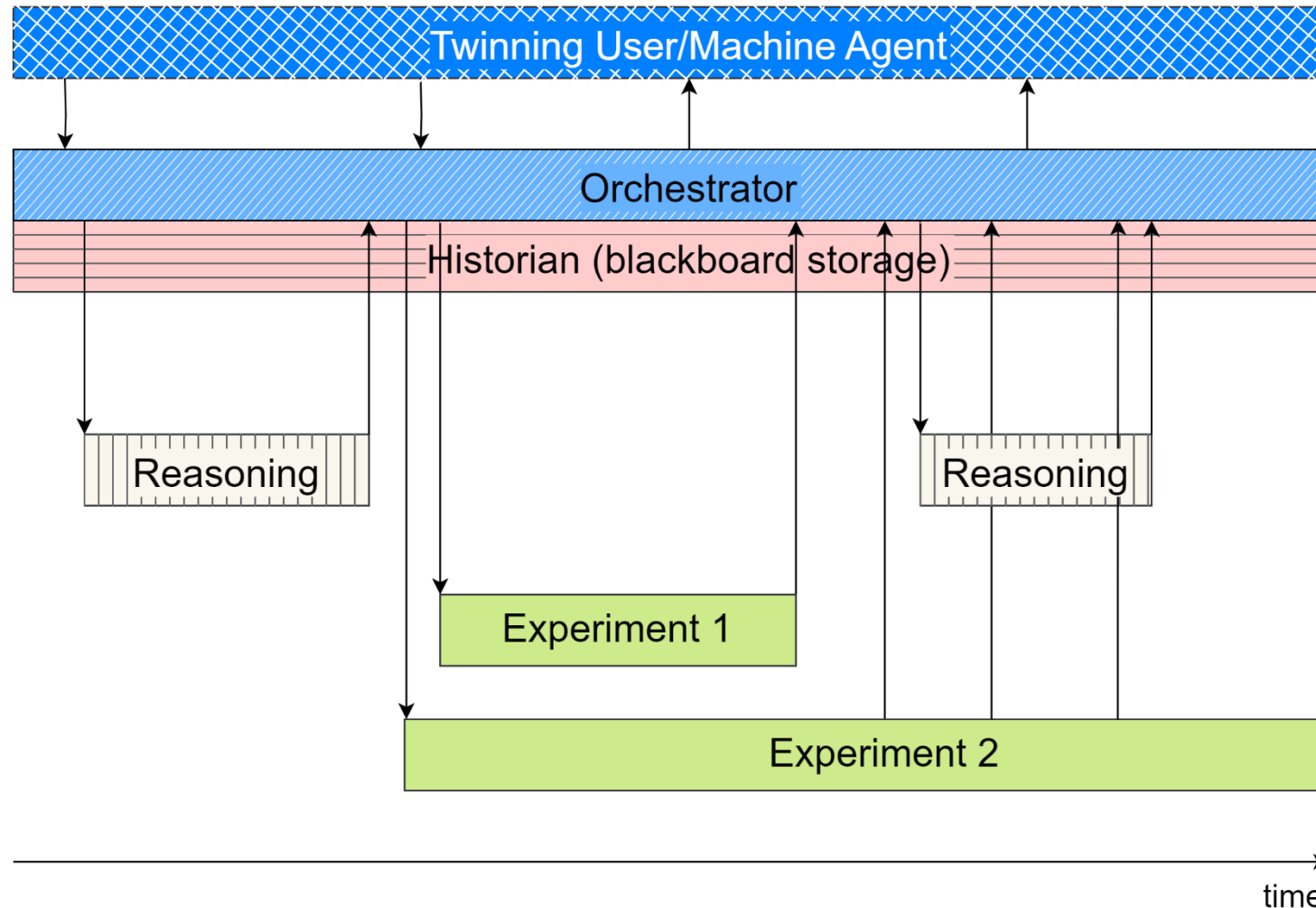
Research Questions

- **RQ1:** *What are the most common reasons/definitions for (creating) Digital Twins (DTs)?*
- **RQ2:** *Given the large number of existing DTs in the literature, can we unify?*
- **RQ3:** *Is there a relationship between specific DT requirements, the system architecture, the used models, and the eventual deployment?*
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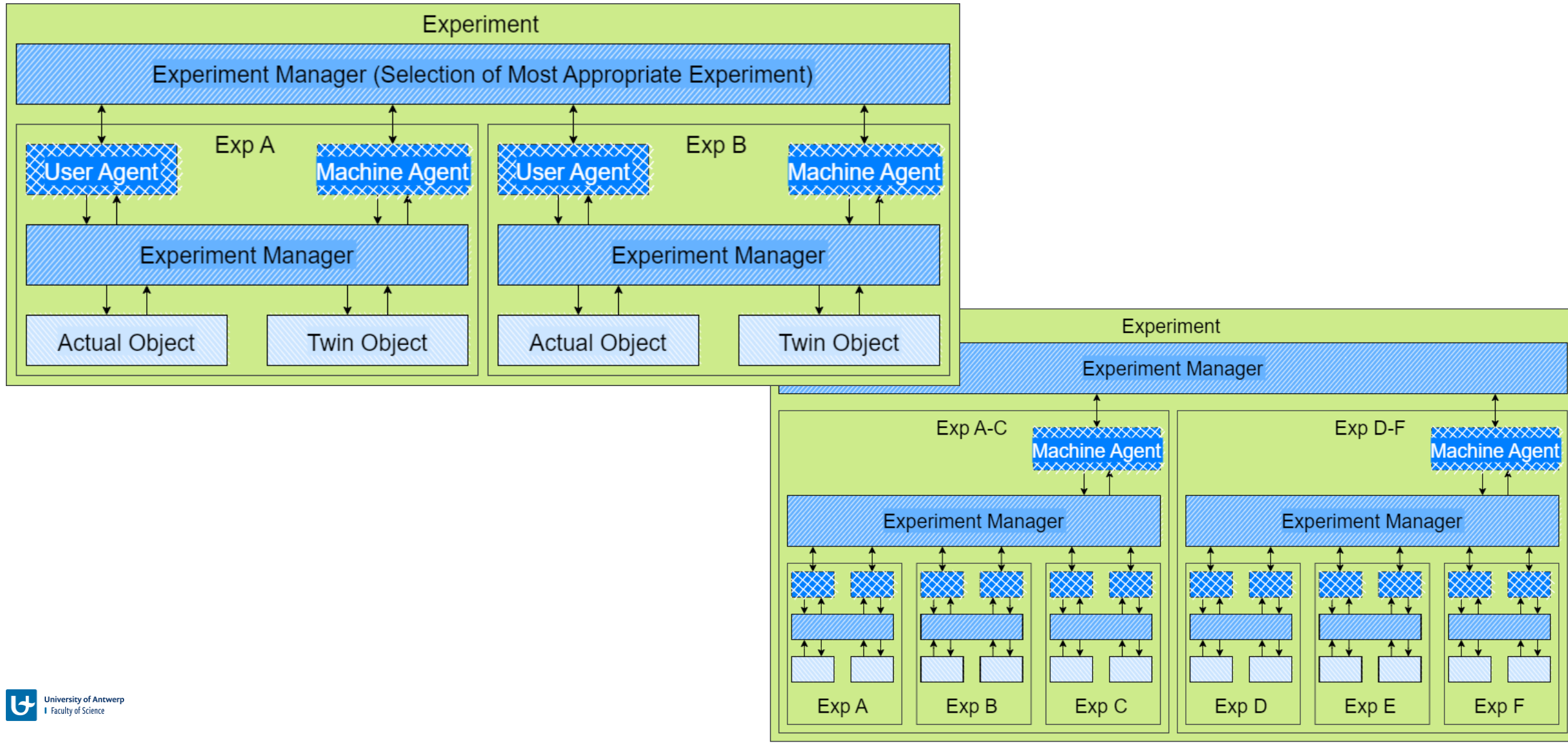
Conceptual Architecture(s)



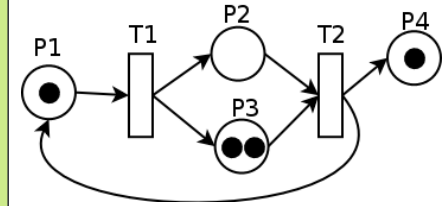
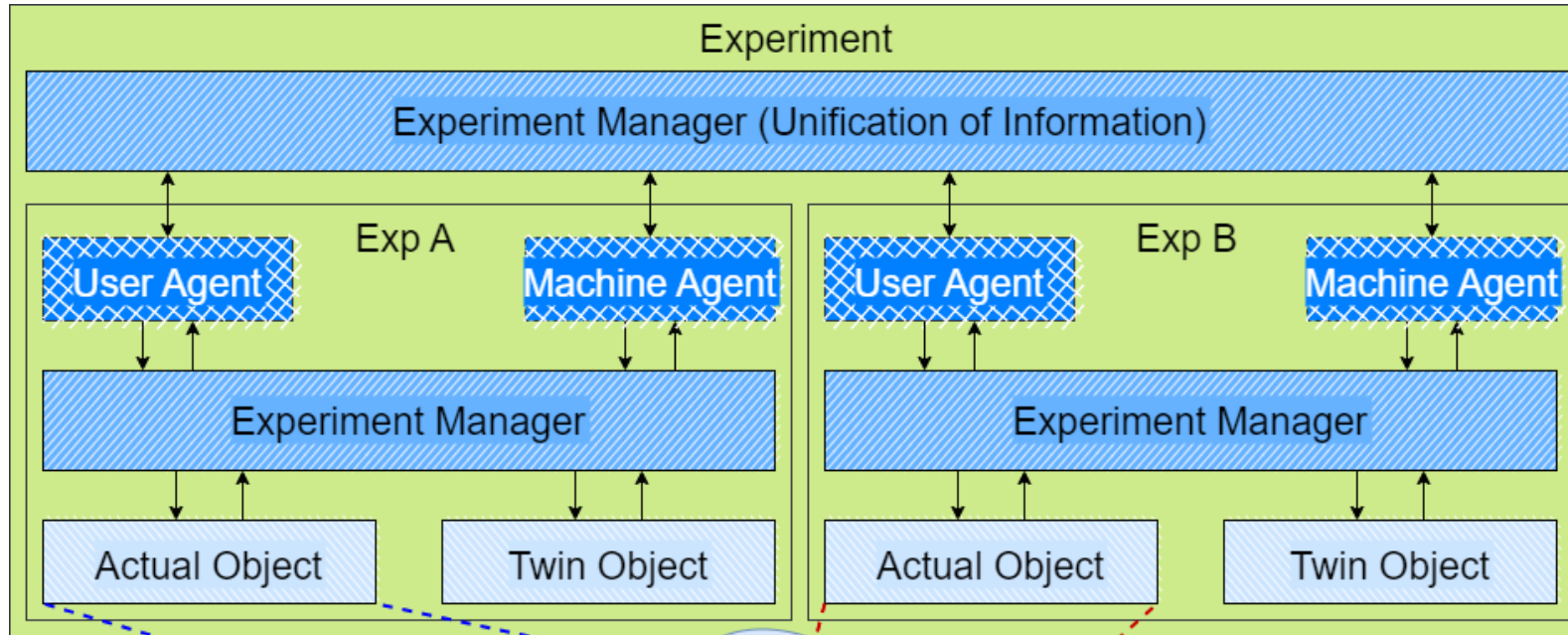
Conceptual Architecture(s)



Combining Twinning Experiments (TEs)

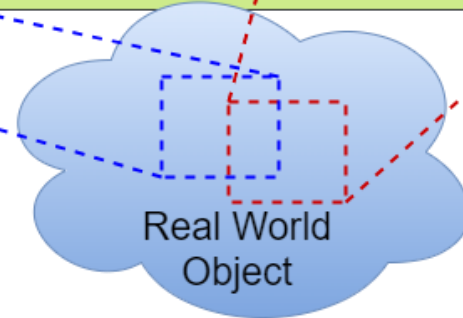


Combining TEs – Multiple Pols

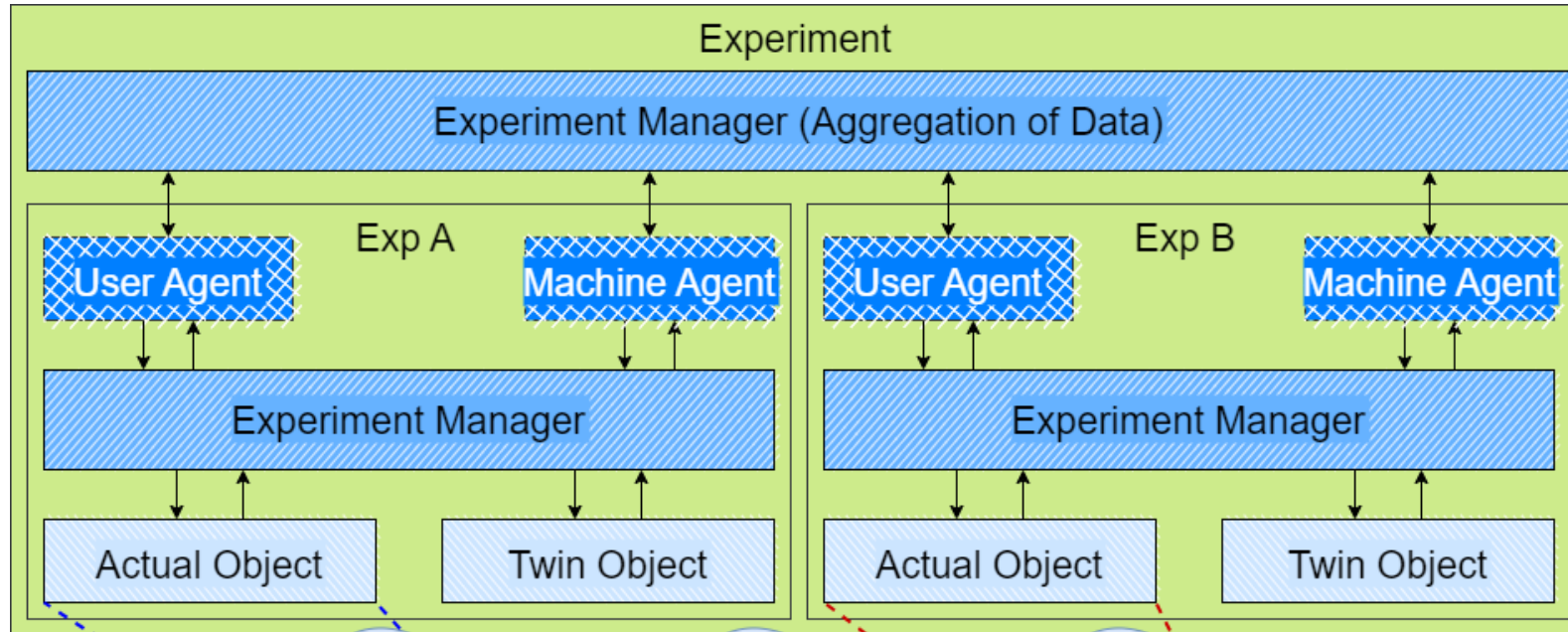


```

start ExpA and ExpB
while not finished do
  A ← Collect data from ExpA
  B ← Collect data from ExpB
  yield union of A and B
end while
  
```

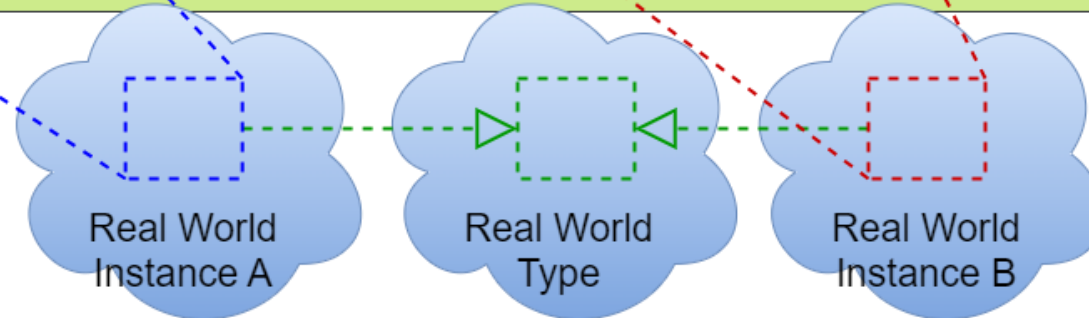


Combining TEs – Multiple Instances vs Types

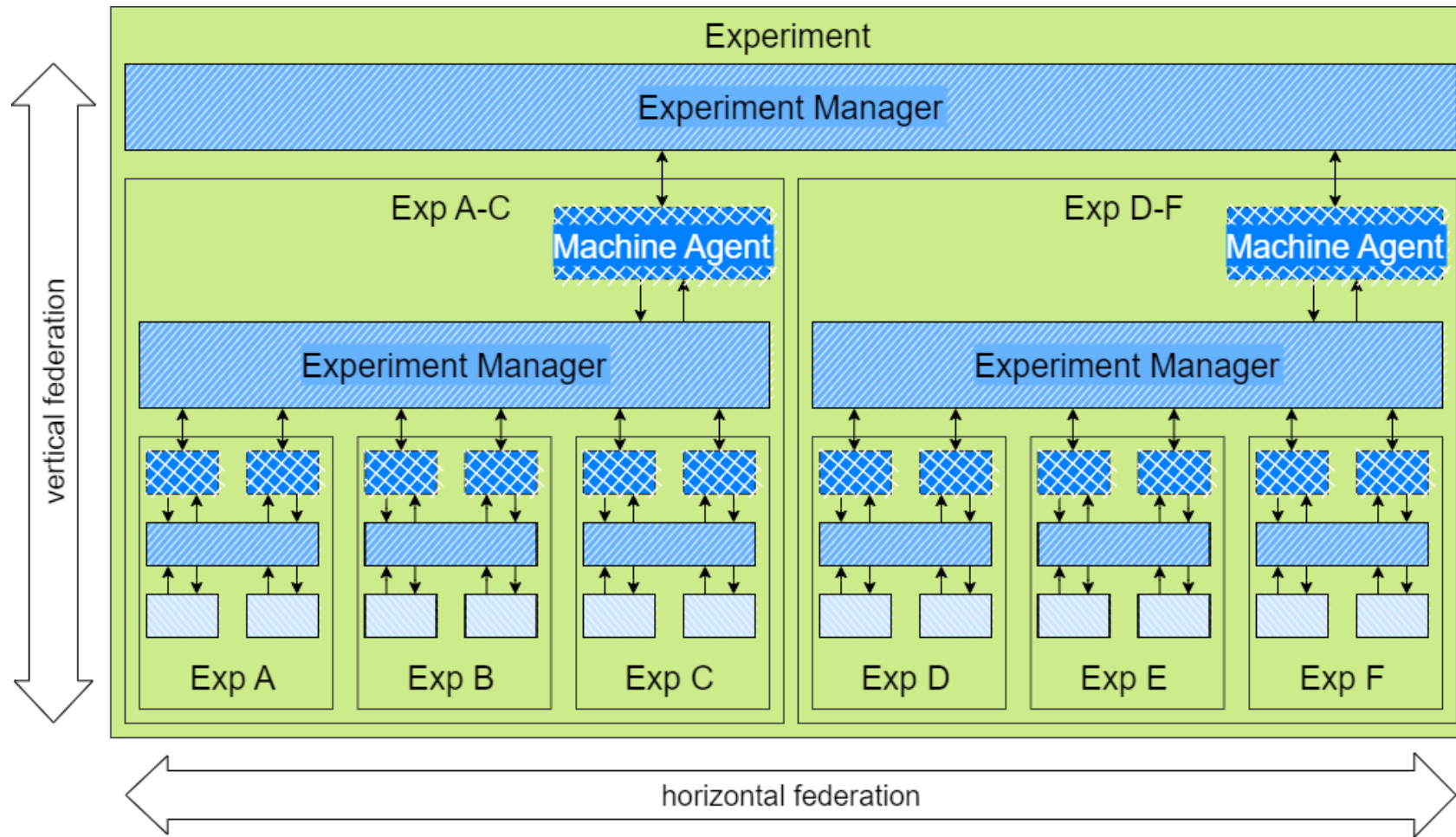


```

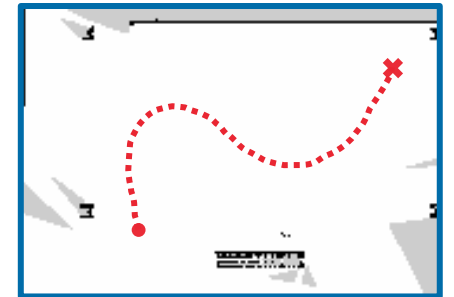
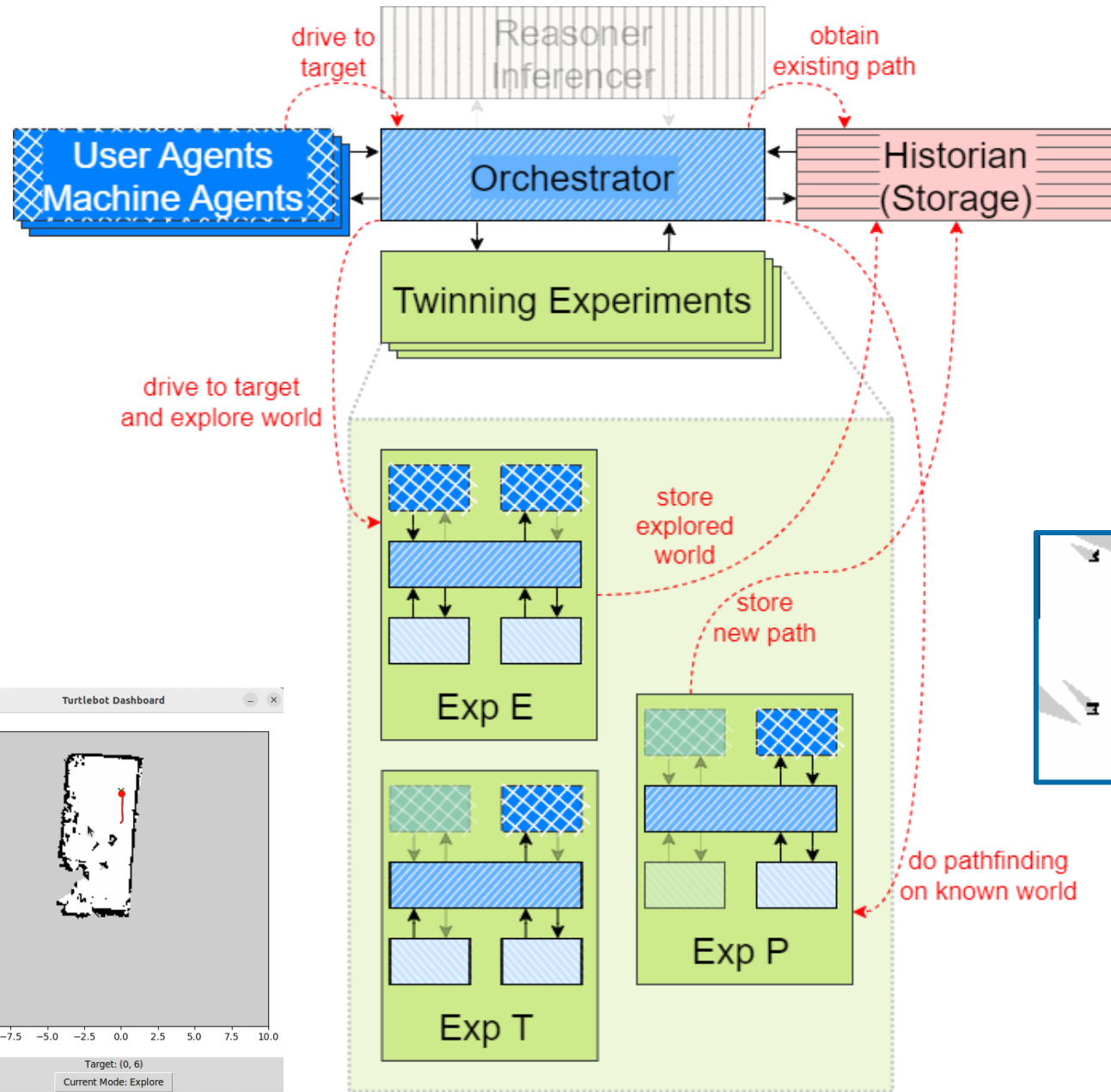
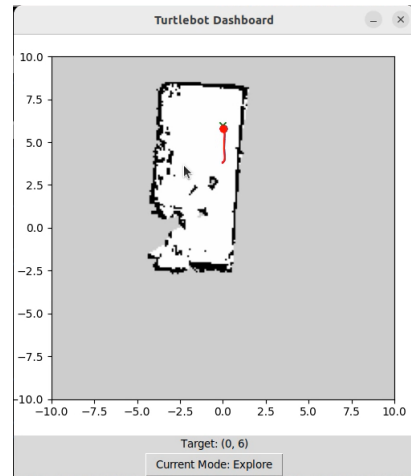
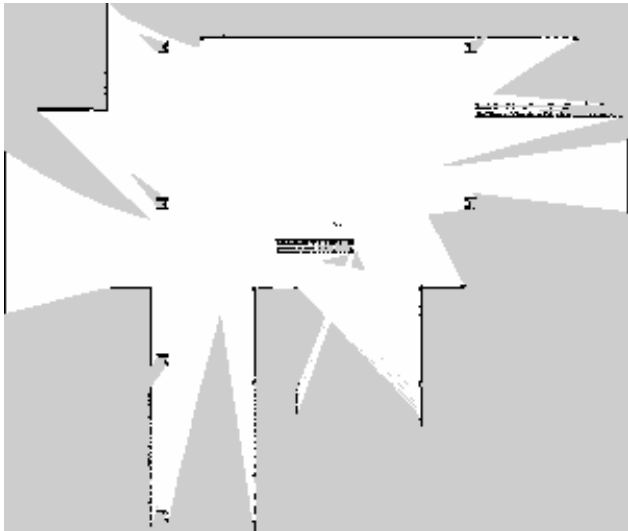
start ExpA and ExpB
while not finished do
  A ← Collect data from ExpA
  B ← Collect data from ExpB
  Type ← aggregate(A, B)
  yield Type
end while
    
```



Combining TEs – Multiple Combinations



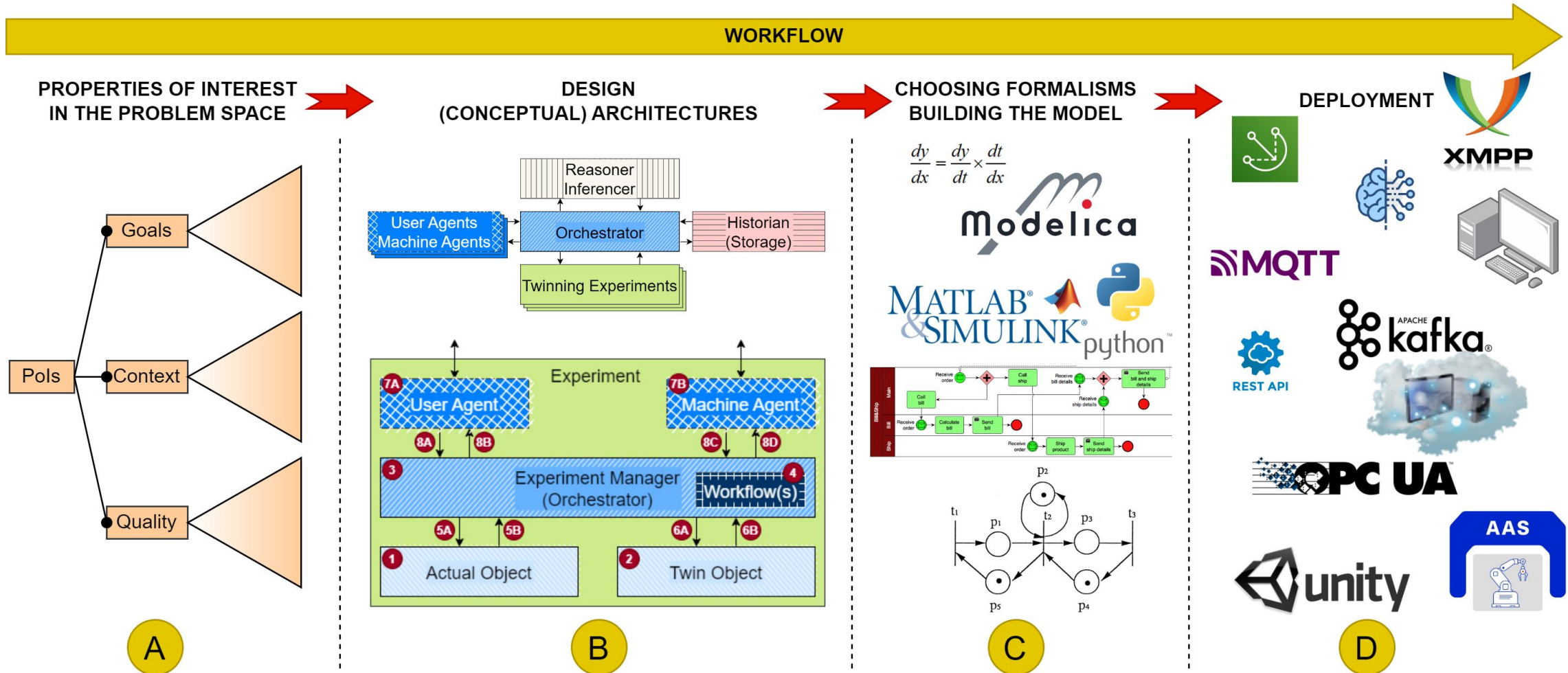
Proof-of-Concept: Turtlebot



Research Questions

- **RQ1:** *What are the most **common reasons/definitions** for (creating) **Digital Twins (DTs)**?*
- **RQ2:** *Given the large number of existing **DTs** in the literature, can we **unify**?*
- **RQ3:** *Is there a **relationship** between specific **DT requirements**, the system **architecture**, the used **models**, and the eventual **deployment**?*
- **RQ4:** *How to quantitatively support **deployment choices**?*
- **RQ5:** *How can we conveniently **combine multiple DTs** into a larger system?*

Stages of Twinning Variability (main contribution)



Future Work

- **RQ2:** *Given the large number of existing **DTs** in the literature, can we unify?*
 - The literature needs to be re-studied and this unification needs to be shown
- **RQ3:** *Is there a **relationship** between specific **DT requirements**, the system **architecture**, the used **models**, and the eventual **deployment**?*
 - Interaction between these stages still needs to be analyzed
- **RQ5:** *How can we conveniently **combine multiple DTs** into a larger system?*
 - These combinations need to be verified against the literature

