Knowledge Structures over Simulation Units

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Do you know what your digital twin is twinning?













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- Common data representation
- Data view on both twins
- Twinning as data property

Knowledge Structures



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W3C Standards

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OWL: GrandParent subClassOf hasChild some (hasChild some Person)



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OWL: GrandParent subClassOf hasChild some (hasChild some Person)

SPARQL: SELECT ?x WHERE { ?x a GrandParent }



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- Export program state with simulators as knowledge graph
- Formulate constraints over combined knowledge



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Combining the Knowledge

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Possible Constraints

- Constraint on asset model
 "Is the asset model consistent?"
- Constraint on program
 "Is this a sensible simulation structure?"
- Constraints on twinning

"Does the program have the same structure as the asset?"



Asset Model

An asset model is an organized, digital description of the composition and properties of a physical asset.

Our Asset Model

A knowledge graph describing the structure of the physical twin.



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ast:heater1 a ast:Heater. ast:heater1 ast:in ast:room1. ast:heater2 a ast:Heater. ast:heater2 ast:in ast:room2. ast:heater1 ast:id 13. ast:heater2 ast:id 12. ast:room1 ast:leftOf ast:room2.



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htLeftOf subPropertyOf ast:in o ast:leftOf o inverse(ast:in)



Additionally to the data of the asset/physical twin, we can inter-

pret the program state as data of the digital twin.



























SMOL: Integration of Programs and Knowledge

Map each program state to a knowledge graph and allow program to operate on the KG. Implemented in SMOL (smolang.org).

1 class C (Int i) Unit inc() this.i = this.i + 1; end end 2 main C c = new C(5); Int i = c.inc(); end



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2 main C c = new C(5); Int i = c.inc(); end
```

```
prog:C a prog:class. prog:C prog:hasField prog:i.
run:obj1 a prog:C. run:obj1 prog:i 5.
```

Simulation Units



Functional Mock-Up Interface (FMI)

Standard for exchange of black-box (co-)simulation units, called function mock-up units (FMUs).

- Directly exportable from simulation frameworks
- Wrapper around existing simulators
- Can also serve as interface to sensors and actuators.



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Model Description

The FMI defines a set of functions on an FMU (e.g., advance time via doStep) and a format for the interface of the FMU.

Model Description



```
<fmiModelDescription fmiVersion="2.0" modelName="Example" ...>
 <CoSimulation needsExecutionTool="true" .../>
 <ModelVariables>
   <ScalarVariable name="p" variability="continuous"
                   causality ="parameter">
     <Real start="0.0"/>
   </ScalarVariable>
   <ScalarVariable name="input" variability ="continuous"
                   causality ="input">
     <Real start="0.0"/>
   </ScalarVariable>
   <ScalarVariable name="val" variability = "continuous"
                   causality ="output" initial ="calculated">
     <Real/>
 </ModelVariables>
 <ModelStructure> ... </ModelStructure>
</fmiModelDescription>
```

SMOL and FMI



Functional Mock-Up Objects (FMOs)

Tight integration of simulation units using FMI into programs.

1 //setup

- 2 Cont[out Double val] shadow =
- 3 simulate("Sim.fmu", input=sys.val, p=1.0);
- 4 Cont[out Double val] sys = simulate("Realsys.fmu");
- 5 Monitor m = **new** Monitor(sys, shadow); m.run(1.0);

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Integration

- Type of FMO directly checked against model description
- Variables become fields, functions become methods
- Causality reflected in type



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```
1 //simplified shadow
2 class Monitor(Cont[out Double val] sys,
3 Cont[out Double val] shadow)
4 Unit run(Double threshold)
5 while shadow != null do
6 sys.doStep(1.0); shadow.doStep(1.0);
7 if(sys.val - shadow.val >= threshold) then ... end
8 end ...
```

Is this twinning something? Is this setup correctly?

Constraints on Digital Twins

SMOL and FMI

2



SMOL with FMOs

FMOs are objects, so they are part of the knowledge graph.

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 - Cont[**out** Double val] shadow)

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SHACL

Define structural requirements as graph constraints in SHACL.

Example

Every monitor has a shadow FMU in its shadow field.

SHACL ignores reasoning, pure data constraints.



Define structural requirements as queries in SPARQL on *combined* knowledge graph, to use domain constraints on digital twins.



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```
1 class Room(Cont[...] f,
2 Wall inner, Wall outer, Controller ctrl,
3 Int id) end
4 class Controller(Cont[...] f,
5 Room left, Room right, Int id) end
6 class InnerWall(Cont[...] f, Room left, Room right) end
```



Define structural requirements as queries in SPARQL on *combined* knowledge graph, to use domain constraints on digital twin.

Query to detect non-sensical setups:



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Query to check structural consistency for heaters:



Semantic Reflection

One can use the knowledge graph *within* the program to detect structural drift: Formulate query to retrieve all mismatching parts

```
1 ....
2 List<Repairs> repairs =
3 construct("SELECT ?room ?wallLeft ?wallRight WHERE
4 {?x ast:id ?room.
5 ?x ast:right [ast:id ?wallRight].
6 ?x ast:left [ast:id ?wallLeft].
7 FILTER NOT EXISTS {?y a prog:Room; prog:id ?room.}}");
```

Repair function must restore structure.

Conclusion



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- Semantic lifting of FMOs
- Using ontological information to formulate twinning



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On-Going and Future Work

- Reconfiguring DT based on changes in asset model
- Adding ontological information to FMI model description



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Thank you for your attention