Semantic Grounding for Stream Reasoning through Ontology-Based Introspection

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Introduction

My research topic: "Grounded spatio-temporal **stream reasoning** with on-demand knowledge acquisition through collaboration and the Semantic Web"

- Background in symbolic artificial intelligence
- Interested in combining subsymbolic with symbolic AI: sense-reasoning gap

Reasoning



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Grounding Stream Reasoning

Ontology-Based Introspection

System Overview

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Stream Processing with DyKnow **Ontology-Based Introspection** Conclusions Grounding Stream Reasoning Ontology-Based Introspection System Overview

Introduction



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 - Maintaining Correspondence
 - Semantic Matching

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Grounding Stream Reasoning Ontology-Based Introspection System Overview

Grounding Stream Reasoning

A temporal logic formula consists of a number of symbols, including **features**, sorts and objects:

 $\forall u \in \mathsf{UAV} : u \neq \mathsf{uav1} \rightarrow$ $\Box(\mathsf{Altitude}[\mathsf{uav1}] > 20 \lor \mathsf{XYDist}[u, \mathsf{uav1}] > 10)$



Grounding Stream Reasoning Ontology-Based Introspection System Overview

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Grounding Stream Reasoning Ontology-Based Introspection System Overview

Grounding Stream Reasoning

Given a functional system, such as a robot, producing streams the integration problem for logic-based stream reasoning is to connect symbols in formulas to streams in the functional system so that the symbols get their intended meaning.



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Grounding Stream Reasoning Ontology-Based Introspection System Overview

Ontology-Based Introspection

Our approach applies **ontology-based introspection** to model and query streaming configurations. It makes use of

- an ontology consisting of concepts and relations between concepts, utilising the Web Ontology Language (OWL),
- semantic annotations for stream transformations describing the features they handle, and
- a **feature specification**, such as a feature symbol in a formula.



Introduction

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System Overview



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Stream Processing with DyKnow



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Stream Processing with DyKnow

Stream processing components:

- Streams are sequences of time-stamped values.
- **Transformations** are stream generating functions that take streams as input.
- Computation Units are transformation instances.

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Stream Processing with DyKnow

Configuration specifications can describe how to combine transformations to generate some stream. For example:

```
<spec:specification>
 1
 2
       <spec:insertions>
 3
           <spec:cu name="result" type="project2Dto3D">
 4
               <spec:cu type="fusionRGBIR">
 5
                  <spec:cu type="rgbCam" />
 6
                  <spec:cu type="irCam" />
 7
               </spec:cu>
8
               <spec:cu type="GPSto3D">
9
                  <spec:cu type="gps" />
10
               </spec:cu>
11
           </spec:cu>
12
       </spec:insertions>
13
       <spec:removals>
14
           < --- Removals based on names of transformations and CUs -->
15
       </spec:removals>
16
   </spec:specification>
```

Ontology for Configuration Modeling Maintaining Correspondence Semantic Matching

Ontology-Based Introspection



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Ontology for Configuration Modeling Maintaining Correspondence Semantic Matching

Ontology for Configuration Modeling

Motivation:

- An ontology gives a common vocabulary with which configurations can be described and shared.
- Allows for semantically annotating transformations through properties.
- Closely related to e.g. the OWL-S service ontology.



Ontology for Configuration Modeling Maintaining Correspondence Semantic Matching

Ontology for Configuration Modeling

Stream Constant Stream is-a Sample 'Complex Transformation' is-a Transformation Source Example computation unit: is-'Computational Unit' Sink :dyknow_cu1 a :ComputationalUnit ; 'Stream Space Stream Universe 2 :hasInput :dyknow_stream1 ; Thing _is-a 3 :hasInput :dyknow_stream2 ; Feature 'Stream Annotation' is-a :hasOutput :dyknow_stream3 ; Δ is-a 5 :instantiationOf :fusionRGBIR . Annotation is-a Description Sequence is-a js-a Specification 'Transformation Annotation Sort Constraint 'Transformation Specification' js-a 'Stream Specification'

Ontology for Configuration Modeling Maintaining Correspondence Semantic Matching

Ontology for Configuration Modeling

Example transformation with semantic annotation:

```
:fusionRGBIR a :Transformation :
       :hasAnnotation [
 3
           :hasOutputAnnotation
                :describesFeature :ImagePosition :
 4
 5
                :describesSort :Human
 6
           1;
 7
            :hasInputAnnotation
 8
                :describesFeature :RawRGBCam :
 9
                :describesSort :self :
10
                :nextSegment [
                   :hasInputAnnotation [
11
12
                        describesFeature 'RawIRCam'
13
                       :describesSort :self
14
15
16
17
        1:
18
       :hasName "fusionRGBIR" ^^ string .
```



Ontology for Configuration Modeling Maintaining Correspondence Semantic Matching

Maintaining Correspondence

The configuration model needs to be **continuously updated** to reflect the actual configuration:

- Stream Processing Engine receives configuration specifications and executes them. Changes are reported over a status stream.
- The Semantics Manager listens to the status stream and updates the configuration model.



Ontology for Configuration Modeling Maintaining Correspondence Semantic Matching

Semantic Matching

Semantic Matching is the task of providing stream specifications given a desired feature specification.

- Given a desired feature, find all transformations producing that feature.
- Recursively make those transformations' input features the new desired features.
- A valid transformation tree has transformations with no inputs as leafs.
- **(**If multiple transformation trees exist, combine or choose one.

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Ontology for Configuration Modeling Maintaining Correspondence Semantic Matching

Semantic Matching

Consider the following example transformations:

- gps : $\emptyset \Rightarrow \mathsf{GPS}[\mathsf{self}]$
- imu : $\emptyset \Rightarrow \mathsf{IMU}[\mathsf{self}]$
- rgbCam : $\emptyset \Rightarrow \mathsf{RGB}[\mathsf{self}]$
- irCam : $\emptyset \Rightarrow \mathsf{IR[self]}$
- attitude : $IMU[Thing] \Rightarrow Attitude[Thing]$
- GPSto3D : GPS[Thing] \Rightarrow GeoLocation[Thing]
- humanDetector : $RGB[RMAX], IR[RMAX] \Rightarrow PixelLocation[Human]$
- humanCoordinates : PixelLocation[Human], GeoLocation[RMAX], Attitude[RMAX] \Rightarrow GeoLocation[Human]

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Ontology for Configuration Modeling Maintaining Correspondence Semantic Matching

Semantic Matching



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Ontology for Configuration Modeling Maintaining Correspondence Semantic Matching

Semantic Matching



DyKnow Ontology

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Conclusions

- Ontologies can be used to model stream processing.
- Semantic annotations provide high-level descriptions of transformations.
- Semantic matching makes use of ontology-based introspection to generate stream specifications automatically.
- Interesting opportunities for extension, such as semantic subscriptions.

