

# Skill-oriented designer of conceptual robotic structures\*

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**Abstract**—This communication presents an application for the use of ontologies in the generation of robot structures. The ontology developed for this app relies on the IEEE Standard Ontologies for Robotics and Automation (ORA) and it incorporates a set of concepts, relations and axioms that link robotic skills with the structural parts needed for their realization. The user can select a base configuration and/or a set of desired skills that the robot should be able to perform. Then, the application evaluates the axioms and returns an abstract structure that can carry out the requested skills. The final implementation of the structure can be achieved with any modular robotic platform that could identify each structural part with a physical device.

## I. INTRODUCTION

Traditionally, robot design has been based on performing a certain task most efficiently and accurately. This design usually consisted of some hardware specifically designed for the task at hand by a group of engineers, and a software heavily oriented to support that specific hardware and to provide only the original design functionalities. In fact, these designs were (more often than not) isolated from, or at least incompatible with, other similar devices.

During the last years, several approaches have tried to address the automation of this design process. Actually, this is a topical issue in robotics which has been addressed in a Workshop at recent ICRA 2018. In [1], robot arm design requirements are encoded as desired motion trajectories for the end-effector. The proposed system enables on-demand design of custom robot arms using a library of modular and reconfigurable parts such as actuators and connecting links. The method generates a functional, as-simple-as-possible robot arm that is capable of tracking the desired trajectories. In [2], formalization, minimality and integration are proposed as other questions that must be addressed in automatic robot design. Nonetheless, the most renowned approaches are based on evolutionary techniques [3], [4]. Evolutionary robot design aims to create robots according to a certain set of initial specifications (inputs), which might be skills, but, instead of a group of engineers, it uses evolutionary

algorithms to automate the process. This allows to obtain different solutions for the same inputs, some of which could be devised by humans, while others could be highly innovative or even game changers for robot design. However, in [5], authors state that, while evolutionary robotics has aimed to optimize robot control and morphology to produce better and more robust robots, most previous research only addresses optimization of control, and does this only in simulation. In order to solve this problem, they developed a four-legged mammal-inspired robot that features a self-reconfiguring morphology. Thus, they discuss the advantages and drawbacks of being able to efficiently do experiments on a changing morphology in the real world.

On the other hand, there is a growing interest in the robotics community on the topic of knowledge representation using ontologies. The publication of the IEEE-ORA Standard [6] in 2015 has been a starting point for many applications. For example, in [7] the authors experimentally demonstrated the applicability of ORA. Ontologies can also help with the relational representation of the environment, allowing for example the *semantic navigation* of robots [8], or with the cognitive representation in social robotics [9]. The standard is being extended by the Autonomous Robotics (AuR) Ontology Working Group of the IEEE [10].

In [11], design is defined as the process of satisfying rather than optimizing. However, in our approach, both processes are present during design: evolutionary robotics might be the optimization tool of the designer, while ontologies could help to satisfy the semantic requirements of the user, provided in natural language. Ontologies add the semantic information needed for giving a mechanical structure a meaning, relating their structural parts to the set of skills enabled by having them. This process provides abstract able configurations and, with them, evolutionary algorithms could explore the space of solutions given by the set of physical devices that could replace each structural part using, for example, a modular robotic platform. Specifically, the directed graph of a robot structure, which can be represented using an ontology, could be seen as the representation of solutions/individuals in evolutionary computation methods.

In [12] the authors presented a robot configuration selector based on desired tasks to be performed by a robot. The selection was performed by matching the desired tasks with the abilities of each base configuration by means of an ontology taxonomy. This work was extended in [13] as a part of an end-to-end educational robots designer operable by non-expert users that uses a modular robotic platform called ParMoR for constructing the physical models.

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In this communication we present a new design procedure that creates abstract robot structures without the need for a base configuration. Our starting point is the Automatic Design of Robots Ontology (ADRON) presented in [12] which is written in SUO-KIF language to be compatible with ORA[6]. ADRON includes classes for different robot morphologies, robotic skills and devices. To improve its functionalities, we have defined a set of relations and laws that impose restrictions on the robot morphology (e.g. a bipedal robot has two legs) and the robotic skills, (e.g. a robot needs feet for walking). In this manner, we add semantic information to the structural parts used in the robot structure creation from natural language requirements.

An application for editing, parsing and visualizing ontologies and instances of ontologies written in SUO-KIF language has been developed. The application allows several modes of design: configuration-based, skill-based and free. The output of this application will be the SUO-KIF instance with the definition of the robot structure.

## II. ADRON

ADRON is an ontology which relies on ORA [6]. The aim of ADRON was to define more specific concepts which were not covered within the standard. Specifically, concepts that allowed the automatic inference of abstract design/selection of a robot given its expected capabilities.

Its potential has already been tested in previous works [12], [13], where ADRON was used to decide, among several predefined base configurations (e.g. humanoid, manipulator, etc.), which one was most adequate to perform a certain set of actions (e.g. walking or grasping), specified as user requirements. The taxonomy included three essential terms of our framework: *RobotAction<sub>A</sub>*<sup>1</sup>, *StructuralRobotPart<sub>A</sub>*<sup>2</sup> and *RobotType<sub>A</sub>*. The system used ADRON to infer the physical parts (*StructuralRobotPart<sub>A</sub>*) needed to carry out those actions and then matched them with the defined base configurations. The base configuration that contained all the *StructuralRobotPart<sub>A</sub>* needed to fulfill the user requirements was selected as the solution.

In this work we move one step further by removing the base configurations, so that our framework is able to build a robot step-by-step by assembling several structural parts, where each of them fulfills some of the user requirements. Note that these requirements are just a set of capabilities (actions the robot is able to perform), not the function/purpose of the robot itself. For example, the function of a robot might be playing football, while the set of capabilities (our system requirements) needed to achieve that function would be translocate, avoid obstacles, sense a ball and propel a ball.

Obviously, this adds more flexibility to our framework while complicating the problem. Thus, an extension of ADRON becomes necessary, since the new proposal requires

more inference power. In the next sections, we present new concepts, relations and axioms which have been added to our previous version of ADRON.

### A. Relations

*StructuralRobotPart<sub>A</sub>* and/or *Device<sub>S</sub>* might be related in different ways: if there is some relative movement between them we say they are articulated (e.g. a leg with a trunk), but for static elements they only need to be connected (e.g. the power supply with an actuator). These are some relations that we have found of interest to work with in the ontology:

- *robotPart<sub>O</sub>* states that a *StructuralRobotPart<sub>A</sub>* belongs to a certain *Robot<sub>O</sub>* instance. It is an ORA concept but very useful in the verification process.
- *robotAbleTo* relates a *Robot<sub>O</sub>* with a *RobotSkill*.
- *robotCanSense* indicates that a *Robot<sub>O</sub>* can measure a certain *Physical<sub>S</sub>* property. It is a subclass of relation *canSense*, which indicates that a *Device<sub>S</sub>* can measure a certain *Physical<sub>S</sub>* property, and also a subclass of *robotAbleTo*. With these relations we provide that the robot inherits the sensing ability provided by a sensor.
- *formedBy* states that a *Device<sub>S</sub>* is composed of others (e.g. an inertial measurement unit is composed of accelerometers and gyroscopes).
- *connectedTo* indicates that two different *StructuralRobotPart<sub>A</sub>* are physically connected.
- *articulatedTo* adds a constraint to *connectedTo*, specifying that there is a joint between the *StructuralRobotPart<sub>A</sub>* related.

### B. Terms

The taxonomy of the terms provided by the ontology is too extensive to be displayed in this communication. Some of the main subclasses are the following:

- *StructuralRobotPart<sub>A</sub>* represent any part that has a semantic meaning in a robot. It is basically divided in *RobotHead*, *RobotTrunk* and *RobotLimb*. This last, in turn, is divided in *RobotLeg* and *RobotArm*. Many other robot parts are still to be added (e.g. hands or wings).
- However, other physical elements, such as *RobotJoint* or *EndEffector*, are directly defined as subclasses of *Device<sub>S</sub>* as they do not add a semantic meaning.
- *Sensor* is a subclass of *Device<sub>S</sub>* which, in turn, has many subclasses that are associated to *RobotSkills*, such as, *LocationSensor*, *DistanceSensor* or *VisualSensor*.
- Other common devices in robotics are grouped under *Actuator*, *ElectricDevice* and *CommunicationDevice* subclasses of *Device<sub>S</sub>*.
- *RobotSkills* are defined as a subclass of *Skill<sub>S</sub>*, where the subject is a *Robot<sub>O</sub>*. The taxonomy for *RobotSkills* is displayed in Figure 1.

### C. Axioms

Many axioms have been included in order to verify the correctness of the instances definition. They provide for different ways of defining different structures. For example, we could directly instantiate the *HumanoidRobot<sub>A</sub>* type or the system

<sup>1</sup>Subscripts indicate concepts previously included in ontologies: *A* for previous version of ADRON, *O* for ORA Standard and *S* for SUMO. Terms without subscripts are new to ADRON in this paper.

<sup>2</sup>Physical artifact which is part of a robot and plays a necessary role when a robot performs an action (e.g. a *RobotLeg* is essential for a robot to walk).



**Algorithm 3** contains(A,B): Verify that logical structure (A) contains (B)

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**Require:** A,B  $\leftarrow$  Structure  
sPA  $\leftarrow$  set of parts  $\in$  A  
sPB  $\leftarrow$  set of parts  $\in$  B  
**for each** pb  $\in$  sPB **do**

if  $\exists$  pa  $\in$  sPA **and** (pa  $\equiv$  pb **or** pa is a descendant of pb) **then**  
Discard pa  
**else**  
**return** A lacks pb, so it does not contain B  
**end if**

**end for each**

sRA  $\leftarrow$  set of relation  $\in$  A  
sRB  $\leftarrow$  set of relation  $\in$  B  
**for each** rb  $\in$  sRB **do**

if  $\exists$  ra  $\in$  sRA **and** ra  $\equiv$  rb **then**  
Discard ra  
**else**  
**return** A lacks rb, so it does not contain B  
**end if**

**end for each**  
**return** A contains B

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**Algorithm 4** add(A,B): Add logical structure (B) to (A)

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**Require:** A,B  $\leftarrow$  Structure  
sPA  $\leftarrow$  set of Part  $\in$  A  
sPB  $\leftarrow$  set of Part  $\in$  B  
**if not** (contains(A,B)) **then**

**for each** pb  $\in$  sPB **do**

if  $\exists$  pa  $\in$  sPA **and** (pa  $\equiv$  pb **or** pa is descendant of pb) **then**  
Discard pa  
**else**

if  $\exists$  pa  $\in$  sPA **and** pa is parent of pb **then**  
Substitute pa with pb  
**else**  
Add pb to sPA  
**end if**

**end if**

**end for each**

sRA  $\leftarrow$  set of relation  $\in$  A  
sRB  $\leftarrow$  set of relation  $\in$  B  
**for each** rB  $\in$  sRB **do**

if  $\exists$  ra  $\in$  sRA **and** ra  $\equiv$  rb **then**  
Discard ra  
**else**  
Create rb  $\in$  A  
**end if**

**end for each**  
**end if**  
**return** A

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The characteristics of each  $RobotType_A$  are inherited by their descendants. If we considered the taxonomy branch regarding legged robots (see Figure 2):

- A  $Robot_O$  has a  $RobotTrunk$  (as  $Robot_O$  is a concept included in ORA, its definition has not been changed and  $RobotTrunk$  is included in each of the robot subclasses instead).
- A  $GroundRobot$  is a  $Robot_O$  with an undetermined locomotion mechanism to move on the ground.
- A  $LeggedRobot$  is a  $GroundRobot$  which uses legs as the locomotion mechanism. It has, at least, one leg.

- A  $BipedRobot$  is a  $LeggedRobot$  that has exactly two legs articulated to the  $RobotTrunk$ .
- A  $HumanoidRobot$  is a  $BipedRobot$  that has two arms and one head (resembling a human form), also articulated to the  $RobotTrunk$ .

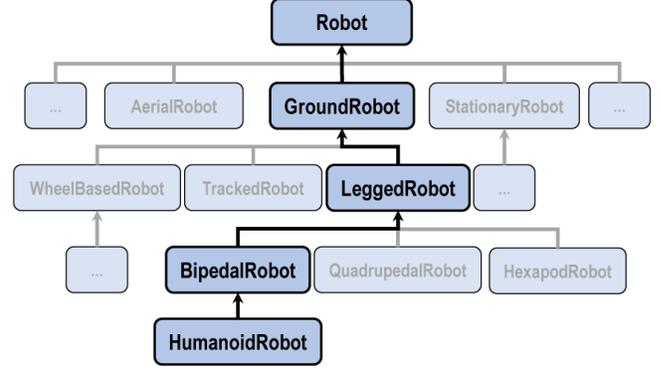


Fig. 2. Taxonomy path from  $HumanoidRobot$  to root class  $Robot_O$ .

Then, the robot type creation algorithm moves from the root class,  $Robot_O$ , to the specific robot type requested adding each of the structural parts included in each subclass.

#### B. Skill-based Mode

In this mode, the user provides a set of skills as requirements and the robot instance is constructed upon them. The robot structure is created as an instance of  $Robot_O$  with a  $RobotTrunk$ . Subsequently, the rest of  $StructuralRobotParts_A$  or  $robotParts_O$  are added (Algorithm 4) depending on the fulfillment of the axioms relating certain  $Devices_S/robotParts_O$  with desired  $RobotSkills$  (Algorithm 2).

#### C. Free Mode

In this mode, the user can freely concatenate available  $StructuralRobotParts_A$ ,  $robotParts_O$  and  $Devices_S$  in any way he considers. The algorithm will check for the fulfillment of the ontology axioms whenever a new element is added (Algorithm 2), as most of these axioms written for the ontology can be used either to infer the missing robot parts to perform a certain skill or to guarantee the consistency of the abstract description of the robot structure.

These three modes could be used jointly if needed (see Section IV-D for an example).

## IV. APPLICATION AND CASE STUDY

In order to test the validity of the approach, a graphical application written in JAVA has been developed. It has three functionalities: editor, SUO-KIF parser and robot designer.

#### A. Parser

Writing an ontology is a tedious task. Other languages such as OWL have useful tools for creating and editing ontologies with friendly interfaces that leverage the task. To help debug our ontology files, a SUO-KIF parser that simplifies the debugging process of the ontology has been written. It indicates the closure of the different elements

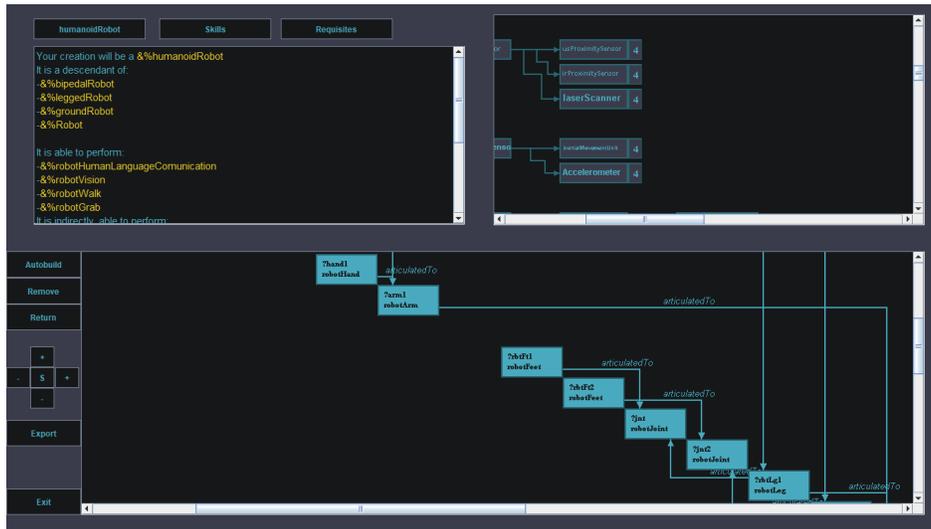


Fig. 3. Screen capture of designer application.

of the language such as instances, subclasses or logical particles. The parser is also responsible for extracting the ontology knowledge into classes and objects that be manipulable within the JAVA code.

### B. Editor

As a companion for the parser, a simple text editor with SUO-KIF syntax highlighting has been programmed, to be used jointly with the parser: the one finds the syntax errors, the other allows file edition simultaneously. In this manner the debugging process is simpler and faster. This is a nice feature as, to our knowledge, no other available editor includes SUO-KIF as a supported language for syntax highlight. Although a style sheet could have been created for some widespread text editors, we wanted to join all functionalities in a single application for the aforementioned practical reasons.

### C. Designer

The robot designer allows for the three design modes presented in previous Section. To achieve this, it provides several menus for selecting a robot type (configuration-based), including skills into an existing structure (skill-based) or simply adding any element described in the ontology and attach it to any other robot part (free mode). Figure 3 displays a capture of the designer.

### D. Case Study: Humanoid with Skills

In this section we present a case study on the creation of a humanoid structure with a certain set of skills. This will demonstrate the algorithms for creating instances from robot types (*HumanoidRobot*) and for adding skills to a robotic structure.

1) *Instantiation of a robot type:* When the user selects a certain robot type in the application, Algorithm 1 is executed. For example, if the application is requested to create a *HumanoidRobot* configuration, the algorithm moves from top

(*Robot<sub>O</sub>*) to bottom (*HumanoidRobot*) through the path of the taxonomy shown in Figure 2. The parts described in the axioms defining each subclass are incorporated, but ignoring already included parts:

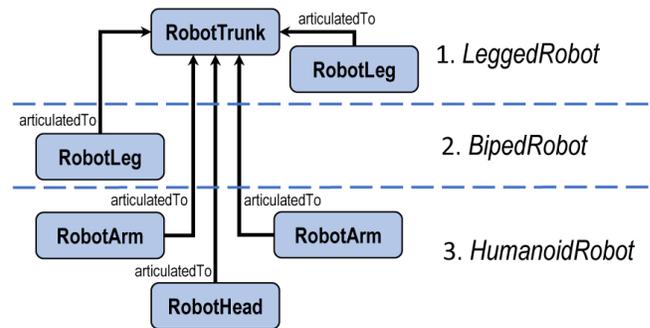


Fig. 4. Instance of a *HumanoidRobot* automatically generated from *RobotType<sub>A</sub>* taxonomy and axioms.

- 1) As a *LeggedRobot*, the robot must have at least one leg. Therefore, the algorithm creates the *RobotTrunk* and includes a *RobotLeg* that have a relation *articulatedTo* with the *RobotTrunk*.
- 2) Then, as a *BipedRobot*, the algorithm infers that there should be two *RobotLegs* *articulatedTo* the *RobotTrunk*. As one of them already exists, only one more is added.
- 3) Finally, as a *HumanoidRobot* the algorithm inserts two *RobotArms* and a *RobotHead* that have a relation *articulatedTo* with the *RobotTrunk*.

The result is the instance of Figure 4.

2) *Addition of skills:* After having created the robot configuration, we can add skills to it to provide new capabilities. These skills, in turn, need devices and/or robot parts that must be added to the structure. We have added the following skills to the humanoid robot base:

- 1) *RobotWalk* requires having feet<sup>3</sup>. These could have an *articulatedTo* relation with the *RobotLegs*, but they can also be *connectedTo* a *RobotJoint* that is, in turn, *connectedTo* the *RobotLeg* (that is exactly the content of the axiom involving *articulatedTo* relation). Also the ability to perform any movement requires that an *ActuatorSystem* be part of the legs and an *ElectricSystem* powering them. Finally, the coordination of the movements of each robot part needs a *ProcessingSystem*.
- 2) *RobotGrab* demands a mechanism of grasping objects. This could be a *RobotHand articulatedTo a RobotArm*. In principle, there is no need for two hands in order to grab something, hence the designer places a single hand in one of the *RobotArms*.
- 3) *RobotVision* involves a perception system such as a *Camera*<sub>S</sub>. This is not a skill by itself, but a requisite for many other skills such as face recognition or object detection which are yet to be added to the ontology.
- 4) *RobotCommunication*, understood as verbal communication between a human and a robot, needs a *Device*<sub>S</sub> for listening, such as a *Microphone*, and another for talking, such as a *LoudSpeaker*.

The complete robot structure instance is shown in Figure 5.

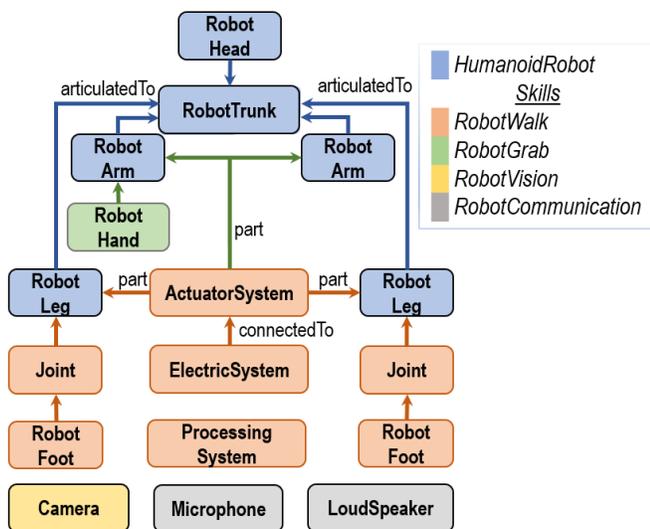


Fig. 5. Instance of a *HumanoidRobot* with a set of skills. The color code indicates the parts added to the robot with each skill (in order).

## V. DISCUSSION AND CONCLUSIONS

A procedure for creating conceptual robotic structures have been presented in this paper. It bases upon the knowledge stored in an ontology, which, with an adequate set of axioms on addition to a well structured taxonomy, can be used to generate robots that are able to carry out a certain set of skills demanded by the user.

An application to edit and debug SUO-KIF ontologies has been developed for helping in the process of creation. Also a

<sup>3</sup>Following the Merriam-Webster dictionary definition (*to move along on foot*'), we assume that the act of walking does need feet. Otherwise, it would be a different type of translocation.

robot designer GUI has been presented. This designer allows three different modes to creates the conceptual structures of a robot: configuration-based, skills-based and free mode. A beta version of both the application and the ontology can be found in an open GitHub repository<sup>4</sup>.

Still, we are aware that there is a considerable gap for these conceptual structures to materialize into physical designs that are effectively able to perform the demanded skills as promised. However, we consider that evolutionary algorithms, taking these structures as their initial population, (jointly with a versatile modular robotic platform such as ParMoR), might be able to find constructable solutions in an automated manner.

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<sup>4</sup><https://github.com/CrisFisher/Ontology-for-Robotics>