# UBIQUITOUS KNOWLEDGE MODELING FOR DIALOGUE SYSTEMS

Porfírio Filipe<sup>1,2</sup>, Nuno Mamede<sup>1,3</sup>

<sup>1</sup> L<sup>2</sup>F INESC-ID - Spoken Languages Systems Laboratory, Lisbon, Portugal

<sup>2</sup> ISEL – Instituto Superior de Engenharia de Lisboa, Lisbon, Portugal
<sup>3</sup> IST – Instituto Superior Técnico, Lisbon, Portugal

Keywords: Spoken Dialogue System, Domain Model.

Abstract: The main general problem that we want to address is the reconfiguration of dialogue systems to work with a generic plug-and-play device. This paper describes our research in designing knowledge-based everyday devices that can be dynamically adapted to spoken dialogue systems. We propose a model for ubiquitous knowledge representation that enables the spoken dialogue system to be aware of the devices belonging to the domain and of the tasks they provide. We consider that each device can be augmented with computational capabilities in order to support its own knowledge model. A knowledge-based broker adapts the spoken dialogue system to deal with an arbitrary set of devices. The knowledge integration process between the knowledge models of the devices and the knowledge model of the broker is depicted. This process was tested in the home environment domain.

## **1 INTRODUCTION**<sup>\*</sup>

A Spoken Dialogue System (SDS) should be a computational entity that allows access to any device by anyone, anywhere, at anytime, through any media, allowing its user to focus on the task, not on the tool. Only in the last decade, with major advances in speech technology, have large-scale working systems been developed and, in some cases, introduced into commercial environments (McTear, 2002). Nevertheless, many implementations of dialogue managers perform input interpretation, output generation, and domain dependent tasks. This approach may easily lead to situations in which the Dialogue Manager (DM) is a monolithic component. Monolithic components make it harder to build systems, modular, distributed and reusable components (O'Neill and McTear, 2000). Typically, these issues are addressed through architectures that integrate reusable components. Some progresses can be seen in (Bohus and Rudnicky, 2003), (O'Neill et al., 2003), (Pakucs, 2003), (Polifroni and Chung

2002), (Neto et al., 2003) and (Turunen and Hakulinen, 2003). The main problem we want to address is the reconfiguration of SDSs to deal with heterogeneous plug-and-play devices, which can be seen as a problem of portability across domains.



Figure 1: Adaptation of the SDS to the Domain.

Fig. 1 shows an architecture schema where  $X_n$  is a generic device and A, B, C, and D are the other components of the SDS. Within a ubiquitous domain, we do not know, at design time, all the devices that will be available and which tasks they provide. In order to address this problem we describe a model for ubiquitous knowledge representation, which was introduced in (Filipe and Mamede, 2004). We propose a knowledge model that is shared by each device and by a broker. We assume that the devices have computational (and communication) capabilities to support their own

<sup>\*</sup> This research has been partially supported by Fundação para a Ciência e Tecnologia under project number POSI/PLP/41319/2001 (POSI and FEDER)

knowledge model. The broker, which is the SDS component that manages the Domain Knowledge, dynamically adapts the SDS to deal with an arbitrary set of devices. The basic strategy to work within a ubiquitous domain is the automatic integration of Domain Knowledge from Global Knowledge builtin in the broker and Local Knowledge builtin in the broker and Local Knowledge builtin each device. The Knowledge Integration Process is bilateral: the SDS must be prepared to deal with an arbitrary set of devices (defining Global Knowledge) and each device must be prepared to be operated by the SDS (defining Local Knowledge).

## 2 KNOWLEDGE MODEL

The *Knowledge Model* is composed by three main components: a *Discourse Model*, a *Task Model*, and a *World Model*.



Figure 4: Knowledge Model Main Components.

These components encapsulate the descriptors of the entities that can be mentioned by the user. A general class diagram of the *Knowledge Model* is presented in Fig. 2.

### 2.1 Discourse Model

The *Discourse Model* defines a conceptual support, grouping a set of concept definitions used to describe classes, devices and the tasks they provide.

#### 2.1.1 Concept Definition

A *Concept* is an atomic knowledge unit that has a unique identifier (*ID*). Each concept have a *Linguistic Descriptor* that it describes, in linguistic terms. This descriptor groups *Multi Word Unit* (MWU) composed by single words (*Word*).



Figure 3: Concept Definition.

The concepts have some MWU to define the associated vocabulary: synonyms, acronyms and

even antonyms. Fig. 3 shows the relations between these classes. The vocabulary is organized by language, allowing a multi-lingual definition of the concepts. A concept can also have a *Semantic Descriptor* that has references to other knowledge representations, for instance, an ontology (Gruber, 1992) or a lexical database such as WordNet (WordNet, 2005).



Figure 2: Concept Classes.

The *Discourse Model* organizes the concepts by classes and subclasses as shown in Fig. 4. The most relevant classes are *Device* and *Task*. The other classes are used to represent task roles.

#### 2.1.2 Device and Task Representation

A concept, representing a *Task* name, can be an instance of two subclasses: *Action*, when the task can modify the device state; or *Acquisition*, when it never modifies the device state. A *Device* name is a concept of the class *Name* and a *Device* class can be an instance of two subclasses: *Active*, when providing at least one action task; or *Passive*, when providing only acquisition tasks. For instance, an oven is an active device and a thermometer is a passive device. These device and task classifications are important to prevent task execution conflicts.

#### 2.1.3 Representation of Task Roles

The representation of task roles involves two different aspects: role default *Value* and role *Category* used to establish the role range. The default value can be an instance of two subclasses: *Quantity*, to represent default numbers, for instance, zero; or *Attribute*, to represent default attributes, for instance, the black color. The role category can be an instance of two subclasses: *Collection*, when a role has a limited set of attributes, for instance, the rainbow colors; or *Unit*, when a role represents a physical dimension, for instance, the distance in meters, miles or inches.

### 2.2 Task Model

The *Task Model* represents the set of available tasks provided by existing device(s). Typically, before performing a task, it is necessary to express the argument values or parameters that establish the execution conditions. It is mandatory for these values to be represented in the *Discourse Model*. The *Task Model* is also used to check the state of the world before and after a task execution.

#### 2.2.1 State of the World

The state of the world is represented by the set of individual states of each device. The state of each device is obtained by calling the provided acquisition tasks. For instance, when the task is *"switch on the light"*, we have to check if the *"light"* is not already *"switched on"* and after the task execution, we have to check if the *"light"* has really been *"switched on"*.

### 2.2.2 Task Descriptor

A *Task Descriptor* is used to represent a task in the Task Model. Fig. 5 shows the class diagram.



Figure 5: Task Representation.

A *Task Descriptor* is composed by a unique identifier (*IDT*), a name (*Acquisition, Action*), two optional lists (*In List, Out List*) of roles that describe in and out task parameters and two optional rules (*Rule*) applicable to the state of the world.



Figure 6: Representation of a Task Role.

The *Initial* rule is checked before the task call and must produce the logical value true before the task execution. The *Final* rule is checked after the task execution and must produce the logical value true when a successful task execution occurs. A rule is expressed using relational operators ('<', '>', '=', ' $\sim$ ', '<=', '>=') and logical operators ('Or', 'And').

When we need to specify a task argument value in a rule expression, the ID, of the concept that is the role *Name*, must be between square parenthesis ('[',']'). When we need to specify a simple concept, its ID must be between braces ('{','}'). For instance, we can write the rule " $\{1\} > [2]$ " to denote that. Each task argument is represented in its Task Descriptor by a Role that is associated with other classes (see Fig. 6). A role describes the possible values that can be used to instantiate a task argument. An In Role describes the values that can be used as input parameters. An Out Role describes the values that can be used as output parameters. All roles have a name (Attribute) and a range (Category). Each role has an optional Restriction rule to check the parameters, for instance, the parameter must be positive. An In Role may have an optional default value (Quantity, Attribute). When the default value is not present, the task argument is mandatory. The task roles are organized in two role lists (In Role and Out Role) that have a Validation rule to check their parameters. The validation rule of an In Role list is evaluated before the task execution. The validation rule of an Out Role list is evaluated after the task execution.

### 2.3 World Model

The *World Model* represents the devices that are part of the world. This model integrates two components: a *Type Hierarchy* and a *Mediator* (see Fig. 7).



Figure 7: Model Components and Descriptors.

#### 2.3.1 Type Hierarchy

The *Type Hierarchy* is an aggregation of device class descriptors (*Class Descriptor*). Each device class descriptor has a unique identifier (*IDCL*) and a concept device class name. This descriptor is associated with a set of identical devices and maintains a list of its super classes. For instance, a device class may be either an appliance, or a thermometer, or a window, or a table.

#### 2.3.2 Mediator

The *Mediator* is an aggregation of device descriptors (*Device Descriptor*) that are instances of device classes representing a physical device that provides tasks. Each device descriptor has a unique identifier (*IDA*) and a concept device name.

### 2.4 Knowledge Representation

The knowledge representation is essentially based on the descriptors (*Task Descriptor*, *Device Descriptor*, *Class Descriptor*) that are coupled using bridges (*Bridge*). After the definition of the needed concepts belonging to the *Discourse Model*, we can fill the descriptors without following a predefined sequence. Finally, we can introduce the instances of the bridge class that associate task descriptors to device descriptors (*Bridge T*) and device descriptors to class descriptors (*Bridge C*).



Figure 8: Model Descriptors and Bridges.

Fig. 8 shows the knowledge model descriptors and bridges directly involved in the knowledge representation. A device knowledge model has only one device descriptor that describes the device itself and must have at least one task descriptor. The broker knowledge model does not include any device descriptors, because the device descriptors are added only at runtime.

## 3 KNOWLEDGE INTEGRATION PROCESS

The goal of the Knowledge Integration Process (KIP) is to automatically update the Domain Knowledge (DK), integrating the Global Knowledge (GK) included in the broker and the Local Knowledge (LK) included in the domain devices. The integration process is composed by two other processes: (i) the device attachment process and (ii) the device detachment process.

### **3.1 Similar Concepts**

Two similar concepts cannot exist in the same *Discourse Model*. In this context, we assume that two concepts are similar when: their identifiers are equal, one of theirs semantic descriptors is equal or theirs linguistic descriptors are equal. In special cases, two concepts may be considered as similar by other convenient similarity criteria. At its starting point, the KIP puts side by side the concept definitions in DK and the concept definitions in LK, which are going to be merged. The KIP uses a Conversion Concept Table (CCT), linked to each broker's *Device Descriptor*, to convert identifiers of similar concepts.

## 3.2 Device Attachment Process

When a device is attached (activated), it searches for the broker component of the SDS. After establishing the initial communication, the broker leads the device attachment process following the next nine steps, in order to update its *Knowledge Model*:

- I. A new *Device Descriptor* is added to the broker's *Mediator*;
- II. An empty CCT is linked to the new *Device Descriptor*;
- III. The concepts of the device *Discourse Model* fill the first column of the CCT;
- IV. Each concept in the first column of the CCT, with a similar concept in the broker's *Discourse Model*, is associated with its similar, filling the second column of the CCT;
- V. The other concepts in the first column of the CCT (without a similar concept in the broker's *Discourse Model*) are added to the broker's *Discourse Model*;
- VI. Each new device *Task Descriptor* is added to the broker's *Task Model* and its concepts identifiers are replaced by the existing similar concepts identifiers, using the CCT;
- VII. Each *Class Descriptor* in the device's *Type Hierarchy* is integrated in the broker's *Type Hierarchy* and its concepts identifiers are replaced by the existing similar concepts identifiers, using the CCT;
- VIII. The new *Device Descriptor* is associated with its class descriptor using the appropriate bridge (*Bridge C*);
- IX. The new *Device Descriptor* is associated with its *Tasks Descriptors* using the appropriate bridge (*Bridge T*).

#### **3.3 Device Detachment Process**

When the broker detects that a device has been detached (deactivated), it follows the next five steps, in order to update its *Knowledge Model*:

- I. The *Task Descriptors* exclusively associated with the detached *Device Descriptor* are removed from the broker's *Task Model*;
- II. The *Class Descriptors* exclusively associated (in a bridge or in a CCT) with the device descriptor are removed from the broker's *Type Hierarchy*;
- III. Concepts that appear only in the CCT are removed from the broker's *Discourse Model*;
- IV. The *Bridges* associated to the *Device Descriptor* of the detached device are removed from the broker's *Knowledge Model*;
- V. The *Device Descriptor* of the detached device is removed from the broker's *Mediator*.

## 4 EXAMPLE

This section describes a complete example of local knowledge modeling. For this, we show how to define the content of the local knowledge model components (discourse model, task model and world model). The presented example is intentionally simple; however, it also illustrates the modeling of global knowledge because the model components are the same ones.

This example assumes that we want to control, through a SDS, a "kitchen window" with an electrochromatic glass that can change the visual aspect of the glass to: opaque, transparent, blue, green or red.



Figure 9: Illustration of the Kitchen Window.

Fig. 9 shows the visual aspect of the glass for transparent and opaque.

Table 1: Kitchen Window Task Set.

IDT	Task Name	Role
1	"OPENING"	-
2	"CLOSING"	-
3	"PAINTING"	"COLOR"
4	"ASKING"	&"COLOR"
5	"ASKING"	&"STATE"

Table 1 shows the task identifiers, the task names and the role names of the available tasks. Now we must fill the Knowledge Model of the "*kitchen window*" (defining LK) that should contain only the needed knowledge to allow its subsequent integration in the DK.

#### 4.1 Discourse Model

The task "OPENING" and "CLOSING" do not have roles. The task "PAINTING", that changes the window color, has one input role "COLOR" to receive all the possible colors of the window. The task "ASKING" has two distinct forms with one output role, that allows asking about the current "COLOR" {"BLUE", "GREEN", "OPAQUE", "RED", "TRANSPARENT"} of the window and about the current "STATE" {"OPENED", "CLOSED"}. Table 2 shows the concept identifiers, the classes and the Multi Word Units needed for defining concepts in the Discourse Model.

ID	Class	MWU
$S_1$	Acquisition	asking
O1	Action	closing
O <sub>2</sub>	Action	opening
O <sub>3</sub>	Action	painting, changing
I <sub>1</sub>	Active	artifact
$I_2$	Active	window
B <sub>1</sub>	Attribute	blue, sapphire
B <sub>2</sub>	Attribute	closed
$B_3$	Attribute	green, emerald
$B_4$	Attribute	ink
$B_5$	Attribute	opaque, not clear
$B_6$	Attribute	opened
$B_7$	Attribute	red, ruby
$B_8$	Attribute	transparent, clear
$L_1$	Collection	color
$L_2$	Collection	state
$N_1$	Name	kitchen window

Table 2: Concept Definitions.

The concepts described in Table 2 are used to define: (i) the tasks (in the *Task Model*); (ii) the device classes (in the *Type Hierarchy*); and (iii) the device name (in the *Mediator*).

Table 3: Collection Definitions.

ID Collection	ID Attribute
$L_1$	B <sub>1</sub>
$L_1$	B <sub>3</sub>
$L_1$	B <sub>5</sub>
$L_1$	B <sub>7</sub>
$L_1$	B <sub>8</sub>
$L_2$	B <sub>2</sub>
$L_2$	B <sub>6</sub>

Table 3 presents the collections that are used for establishing the ranges of the task roles. Table 4 shows examples of semantic descriptors obtained from the lexical database WordNet. Columns *Label* and *Sense* (Table 4) are used to identify similar concepts and the *Description* column is used for documentation (it is never used to evaluate the similarity between concepts). Column *ID* is the concept identifier.

ID	Description	Label	Sense
$B_1$	color intermediate between green and violet	adjective	1
B <sub>2</sub>	not open	adjective	3
B <sub>3</sub>	color between blue and yellow in the color spectrum	adjective	1
$B_5$	not clear; not transmitting or reflecting light or radiant energy	adjective	1
B <sub>6</sub>	made open or clear	adjective	2
<b>B</b> <sub>7</sub>	color at the end of the color spectrum (next to orange)	adjective	1
$B_8$	transmitting light; able to be seen through with clarity	adjective	1
O <sub>1</sub>	cause to close or to become close	verb	8
O <sub>2</sub>	cause to open or to become open	verb	1
$S_1$	inquire about	verb	1

Table 4: Semantic Descriptors.

## 4.2 Task Model

After the characterization of the *Discourse Model* we should describe the *Task Model* indicating tasks (see Table 5), task roles (see Table 6) and tasks rules (see Table 7). In Table 7, "&X" is a dummy variable used to receive the returned value from the called task.

Table 5. Task Definitions.		
IDT	ID Name	
1	O <sub>2</sub>	
2	O <sub>1</sub>	
3	O <sub>3</sub>	
4	$S_1$	
5	S.	

Table 5: Task Definition

Table 6: Task Role Definitions.

IDT	ID Name	ID Range	ID Default	Role Type
3	$B_4$	$L_1$	$B_5$	In
4	L <sub>1</sub>	L <sub>1</sub>	-	Out
5	L <sub>2</sub>	$L_2$	-	Out

Table 7: Task Rule Definitions.

IDT	Initial	Final
1	$\{S_1\}(\&X); \&X=\{B_2\}$	$\{S_1\}(\&X); \&X=\{B_6\}$
2	$\{S_1\}(\&X); \&X=\{B_6\}$	$\{S_1\}(\&X); \&X=\{B_2\}$
3	{S <sub>1</sub> }(&X); &X<>[B <sub>4</sub> ]	$\{S_1\}(\&X); \&X=[B_4]$

## 4.3 World Model

The World Model contains the Type Hierarchy and the Mediator. Table 8 shows the Type Hierarchy description where the class  $I_2$  (window) is linked, via *IDSCL* column, to the super class  $I_1$  (artefact).

T	abl	le	8:	Class	D	efin	iti	on
	au		0.	Clabb	~	viii.		UII.

IDCL	ID	IDSCL
1	I <sub>1</sub>	-
2	I <sub>2</sub>	1

In more complex cases, Table 8 may have several class definitions. Table 9 shows the definition of the name of the unique device that is the "*kitchen window*".



#### 4.4 Bridges

Finally, we should link the descriptors using *Bridges*. First, we should link the device (see Table 9) to its class (see Table 8) as is presented in Table 10. Next, we should link the device to its tasks (see Table 5) as is presented in Table 11.

IDA	IDCL
1	1

Table 11: Bridges Device to Task.

IDA	IDT
1	1
1	2
1	3
1	4
1	5

#### 4.5 Task Invocation

The invocation of a task, made by the DM trough the broker (see Figure 1), uses a generic device proxy for sending and receiving the parameters list. The identifiers of the concepts in the parameters list are converted before and after the task invocation using the CCT. For instance, if the DM requests to paint the "*kitchen window*" using the "*RED*" color, the broker will send to the device the concept identifiers O<sub>3</sub> and B<sub>7</sub> obtained using the CCT. Before the task invocation, the DM must check the *Initial Rule* "{S<sub>1</sub>}(&X); &X <> {B<sub>7</sub>}", and, after the task

execution, the DM must also check the *Final Rule* " $\{S_1\}(\&X); \&X=\{B_7\}$ ".

## 5 TESTING KIP

KIP was tested in a home environment domain with common devices and household appliances that are: Air Conditioner (63 - concepts), Freezer (96 - concepts), Fryer (92 - concepts), Light Source (62 - concepts), Microwave Oven (167 - concepts), Table (48 - concepts), Water Faucet (63 - concepts), Window (44 - concepts) and a Window Blind (65 - concepts). All the devices are using 700 concepts. Initially the GK (that is equal to DK) is using 261 concepts. After the attachment of all devices the DK retain 360 concepts. The knowledge integration rate is 360/700\*100 = 51%. Each Knowledge Model for devices and broker is supported by a relational database with 19 (nineteen) tables.



Figure 10: Screenshot of the Domain Simulator.

Fig. 10 show a screenshot of the home environment domain simulator, developed originally for Portuguese users. On the bottom of the screen we can see an electrochromatic Table device simulator. This simulator allows the debug of KIP and the simulation of the interaction made by the Dialogue Manager. We can attach and detach devices, do requests of tasks, obtain the answers and observe the devices behaviour. We can also consult and print several data about the several Knowledge Models and about the task execution progress. Fig. 11 shows the screen of the Fryer simulator after the execution of the request: "frying chinese spring rolls". This screen shows the automatically select temperature (180 °C) and duration (7 minutes) of the frying process. Fig. 12 shows the screen of the Microwave Oven simulator after the execution of the request: "*defrosting carrots*". This picture shows the automatically select power (300 watts – see symbol) and duration (8 minutes) of the defrosting process.



Figure 11: Deep Fryer Simulator.



Figure 12: Microwave Oven Simulator.

Fig. 13 shows the screen of the Freezer simulator after the execution of the request: "asking the amount of carrots". The table in the picture shows the selected type of food. However, the domain simulator also returns the answer "1 package with 300 g" in a text window. We can also execute requests that evolve relational operators, for instance: "asking the type of food with amount less than five".



Figure 13: Freezer Simulator.

The concept "*CARROT*" is shared by the Microwave Oven and by the Freezer. We have only one definition of the concept "*CARROT*" in the broker's Knowledge Model. Fig. 14 shows the screen of the Water Faucet simulator after the execution of the request "*opening the faucet*". The debit of water (30%) and temperature (35 °C) are automatically modified, when we increase or decrease the water debit, or increase or decrease the water temperature.



Figure 14: Water Faucet Simulator.

## **6 DISCUSSION**

In the near future, intelligent devices embedded in everyday artefacts will surround people. This means integration of microprocessors into devices such as household appliances, furniture or even clothing. Achieving interoperability using plug-and-play devices, demands an explicit agreement on meaning, for instance, using controlled vocabularies. In this perspective, it seems that in simple cases, agreement on meaning can be achieved, facilitating the interoperability and the definition of standards. However, the general and special needs of computational systems, such as a SDS, cannot be satisfied with universal specifications that have to be limited due to practical reasons, presenting deficiencies in aspects normally considered essentials. On the other hand, for instance, we could use the FIPA device ontology (FIPA DOS, 2002) to represent memory type, connection, hardware description, software description and so on. Nevertheless, generally, this kind of information is not relevant for SDSs because users are not particularly interested in asking about that kind of information.

### 7 CONCLUSION

The work reported in this paper is a significant contribution to improve the flexibility, and simultaneously the robustness, of the SDS being developed in our lab. Our proposal is about an important issue around plug-and-play architectures: agreement on meaning. We have described a Knowledge Model and a Knowledge Integration Process. This process deals dynamically with communication interoperability between the SDS and a set of heterogeneous devices. The ideas presented in this paper have been applied, with success, in complex devices such as household appliances.

### REFERENCES

- Bohus, D. and Rudnicky, A., 2003. RavenClaw: Dialog Management Using Hierarchical Task Decomposition and an Expectation Agenda. In *Eurospeech 2003*, Geneva, Switzerland.
- Filipe, P. and Mamede, N., 2004. Towards Ubiquitous Task Management. In *Interspeech 2004*, Jeju Island, Korea.
- FIPA DOS, 2002. FIPA Device Ontology Specification (http://www.fipa.org/specs/fipa00091/).
- Gruber, T., 1992. Toward Principles for the Design of Ontologies Used for Knowledge Sharing. In *International Workshop on Formal Ontology*, Padova, Italy Padova, Italy.
- McTear, M., 2002. Spoken Dialogue Technology: Enabling the Conversational Interface. In *ACM Computing Surveys*, Volume 34.
- Neto, J., Mamede, N., Cassaca, R. and Oliveira, L., 2003. The Development of a Multi-purpose Spoken Dialogue System. In *Eurospeech 2003*, Geneva, Switzerland.
- O'Neill, I. and McTear, M., 2000. Object-Oriented Modelling of Spoken Language Dialogue Systems. In *Natural Language Engineering* 6, Cambridge University Press, Cambridge, UK.
- O'Neill, I., Hanna, P., Liu, X. and McTear, M., 2003. An Object-Oriented Dialogue Manager. In *Eurospeech* 2003, Geneva, Switzerland.
- Pakucs, B., 2003. Towards Dynamic Multi-Domain Dialogue Processing. In *Eurospeech 2003*, Geneva, Switzerland.
- Polifroni, J. and Chung, G., 2002. Promoting Portability in Dialogue Management. In *ICSLP 2002*, Denver, Colorado, USA.
- Turunen, M. and Hakulinen, J., 2003. JASPIS<sup>2</sup> An Architecture for Supporting Distributed Spoken Dialogues. In *Eurospeech 2003*, Geneva, Switzerland.
- WordNet. 2005. WordNet a Lexical Database for the English Language (http://wordnet.princeton.edu/).