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Knowledge Representation and Acquisition for 3-D shape Ontologies

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Abstract: In order to build more *intuitive* virtual environments, there is a need for the computer to understand the meaning of virtual objects in a way that reflects common sense knowledge of such objects. This report introduces several mechanisms for building a 3-D shape ontology that eventually would add such common sense knowledge to the What You Say is What You See (WYSWYS) framework [1]. Principally, this can be achieved through ontologies of primitive 3-D shapes and of combination of such shapes into more complex shapes. The representation used for expressing 3-D shapes is accomplished through a two-level ontology approach, that is a knowledge level and a symbol level, where the former is a representation closest that of humans while the later is a high level computer representation in the form of implicit parametric functions. Under the same approach, this report proposes a more detailed ontology hierarchy, mainly concentrating on the evaluation of formal methods for the edition and construction of the symbol level ontology using *Ontolingua* [2], and in knowledge acquisition through knowledge reuse and machine learning techniques, for building the knowledge level ontology. It presents a modification of the case based reasoning (CBR) algorithm PROTOS [3] for this last purpose. To the end, this report also gives guidelines for future implementation and further research topics.

1. Introduction

Communication of mental images in an intuitive way is a very important goal to achieve in human-to-human and human-to-machine interaction. In computer supported cooperative workspace (CSCW) [4] and more recently in the Virtual Space Teleconferencing System -- VSTS [5], being developed at ATR, the need for integration of language and gestures for the manipulation and modification of 3-D shapes led to the WYSWYS framework, where a new communication paradigm was proposed for such virtual environments. One of the most important features of this proposal was to point out the existence of a two-level ontology for bridging the knowledge gap between human and computers. To clarify what the word ontology is, in philosophy it means the study of existence, but in artificial intelligence circles it usually means the set of most primitive terms or concepts that describes something. Applying it to the task of adding visual knowledge to the computer, we can use ontologies to get the machine to understand the meaning of virtual objects in such way that reflects common sense knowledge of such objects. This approach for 3-D shape representation consists of a symbol level and a knowledge level, where the former is a representation closest to that of humans while the later is a high level computer representation in the form of implicit parametric functions that capture the meaning of a shape based on the interpretation of a set of parameters and their values. Common sense about complex 3-D shapes can be expressed through these ontologies of primitive 3-D shapes and of combination of such shapes into more complex shapes at the knowledge level. Indeed, it has been suggested that easy decomposition into parts is the characteristic of basic level categories that determines their high degree of distinctiveness and informativeness [6]. Going further on that line of research this report proposes a more detailed ontology hierarchy and actually describes how each part of this hierarchy can be made.

One of the main problems in building any ontology is to choose the most appropriate tool for creating and editing it, looking towards portability and standards in knowledge representation and current technology. For that purpose, an ontology editor tool from the

Knowledge Sharing Lab. at Stanford University, called *Ontolingua*, has been evaluated by translating the existing rule base system of *shapes* and *adjectives* as part of ATR's most recent VSTS prototype [7], into a formal symbol level ontology in the editor. That implied the creation and design of such ontology that did not exist before.

On the other hand, knowledge acquisition about 3-D shapes, can be achieved either by the reuse of previously built high level ontologies or by machine learning techniques. In that sense the case-based knowledge acquisition algorithm PROTOS was first evaluated and later modified in terms of more adequate learning heuristics for the 3-D shape domain, resulting in a modified PROTOS system. All this in order to build systems that can acquire knowledge and be able to learn, under user guidance, about the complex 3-D shapes that the user builds himself for teaching the computer.

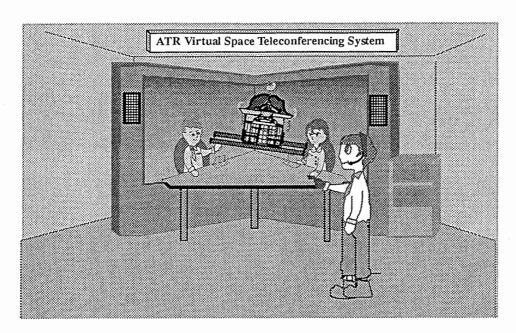


Fig.1 A virtual teleconferencing room. We want to be able to interact with the computer in a more intuitive and intelligent manner.

This report is organized in the following manner. Section 2 gives an overview of the ontology hierarchy, showing the components or sub-ontologies needed to define well the symbol level and knowledge level ontologies. Section 3 actually shows how the symbol level ontology was designed and partially built using Ontolingua. Section 4 introduces the knowledge level ontology for complex shapes and also gives a detailed example of how this ontology can be incrementally built through a knowledge acquisition tool specifically modified for this purpose. Section 5, discusses further possibilities of enriching this ontology with component-relation and shape modification ontologies and how the two level ontology approach allows knowledge reuse. Several appendixes were added, including implementation guidelines for a translator between Ontolingua and Nextpert (the current knowledge base system), and the interface between the knowledge level and system level.

2. Ontology Hierarchy

As shown in Figure 2, The knowledge representation hierarchy consists of three levels: the machine level representation, the symbol level ontology and the knowledge level ontology. While the machine level is not an ontology, and therefore left out of the scope of this report, emphasis will be done in describing both the symbol level and the knowledge level ontologies more in detail, with the recent advances and difficulties in constructing such ontologies.

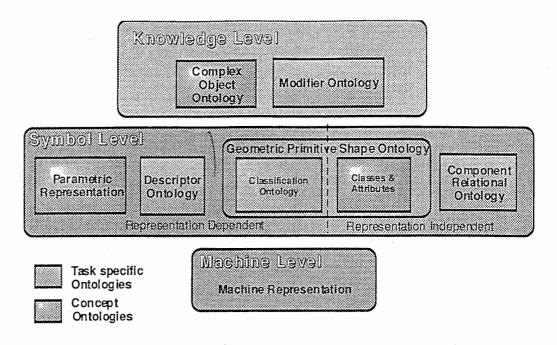


Figure 2. The conceptualized ontology hierarchy

In the figure, *Concept Ontologies* refers to Gruber's [2] definition of an ontology, in other words it refers to a set of definitions of content-specific knowledge representation primitives: classes, relations, functions, and object constants. On the other hand *Task Ontologies*, refers, according to [8], to a vocabulary of concepts for describing the problem solving structure of all the existing tasks in a domain-independent manner.

3. Symbol Level Ontology Design using Ontolingua

In the 3-D shape ontology context a symbol level ontology is the one most proximate to the low-level computer representation of 3-D shapes. Definitions for the parametric representation, chosen for the 3-D shapes, descriptors related with the parameters and basic 3-D primitive shapes such as sphere, cone, cube, etc..., and their representation independent features, are stated in this ontology. Therefore, it is more less a static ontology in the sense that once it is defined, no learning process is needed for further knowledge acquisition. Furthermore the general conception (idea) of an object is not only related to its basic form or shape but also to the way this complex object is organized from other primitives, this is the component-relation ontology, that also belongs to the symbol level, and which formalizes relations between 3-D primitive shapes in order to complete the definition of complex 3-D shapes. It is left for the discussion section.

The existing prototype system for the symbol level ontology had integrated a visualization module with a rule based system for achieving the classification of 3-D primitive shapes. This system was based only on rules and not on a formal specification of an ontology. One of the goals was to create a formal specification of the ontologies listed in the ontology hierarchy. The first problem was how to build such ontologies?

For this purpose we decided to evaluate Ontolingua.

We chose to evaluate Ontolingua, an on-line network service of the Knowledge Sharing Laboratory from Stanford University, for editing and constructing portable ontologies (**), basically because of:

1) Its a tool that gives a methodology and facilitates building complex ontologies in a cooperative way. It also checks consistencies while supporting ontology creation or definition.

Ontolingua: Ontology Editor and Data Base

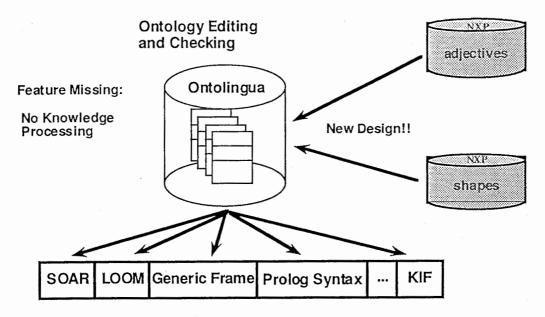


Figure 3. The *Ontolingua* system: an On-line network service of the Knowledge Sharing Laboratory from Stanford University

- 2) Allows portability, knowledge reuse and sharing to some extent. It offers a wide range of existing ontologies (ontology library) which can be integrated into our ontology
- 3) It is compatible with current agent processing technology. The future need for a distributed knowledge processing platform entails us to assume a multi-agent perspective for further research, in which knowledge sharing between agents will be essential

As shown in figure 3, the translation of the existing two level rule base adjectives and shapes, from its original source written as rules in Nextpert Object, an expert system shell, into Ontolingua was done as the first step (see apendix A). Although Ontolingua does not support Knowledge Processing --it wasn't intend to do so, it does support automated translation to several Knowledge Based System's shells and knowledge representation languages such as SOAR, LOOM, Prolog Syntax, Knowledge Inteerchang Format (KIF) etc... The next step is to build a translator between and Nextpert Object for which guidelines are given in section 6.2. Anyway, the actual design of the ontologies were also reflected in the existing system and new definitions and changes were also done in Nexpert Object because of actual system requirements.

In the next two subsections, there is a partial description of how the symbol level ontology was designed and defined using Ontolingua. For more details, the reader can refer to the Appendix A that contains a full description of the ontologies built in Ontolingua.

(**) http://www-ksl-svc.stanford.edu:5915/

3.1. The 3D-Parametric-Models

This ontology is intended to be for the conceptualizing of parametric 3-D solid models for computer graphics. Therefore it can contain any class of mathematical model for representing 3-D shapes. Particularly we have defined one class **Sq-Parametric-Model** that stands for the candidate representation called *superquadrics* recognized as a powerful representation for

intuitively building 3-D models in [9]-[11] and [16]. Supercuadrics are defined by the flowing vector:

```
\begin{split} x &= f(z) cos^{\epsilon_1} \alpha (cose2\omega + a4) \\ y &= g(z) sin^{\epsilon_1} \alpha (cose2w + a4) \\ z &= a3 sin^{\epsilon_2} \omega \\ \text{where, } f(z) &= a1 * (1 - k1 * x / a3) \; ; \text{ and } \\ g(z) &= a2 * (1 - k2 * z / a3) \end{split}
```

In Ontolingua we have classes, relations, functions, and object constants. Here is an example of the definition of the **Sq-Parametric-Model**.

```
;;; Sq-Parametric-Model
(Define-Frame Sq-Parametric-Model
              :Own-Slots
              ((Arity 1)
               (Documentation
                 "This is a 3d solid math model based on a parameter space
                  named superquadrics")
               (Instance-Of Class) (Subclass-Of Thing))
              :Template-Slots
              ((A1 1 (Slot-Value-Type Real-Number))
               (A2 1 (Slot-Value-Type Real-Number))
               (A3 1 (Slot-Value-Type Real-Number))
               (A4 0 (Slot-Value-Type Real-Number))
               (E1 1 (Slot-Value-Type Positive))
               (E2 1 (Slot-Value-Type Positive))
               (K1 0 (Slot-Value-Type Real-Number))
               (K2 0 (Slot-Value-Type Real-Number)))
              :Issues
              ((:Source
                "The definition of the superquadrics model is
                  given by Hirikoshi, as follows:
                        x = f(z) \cos(alpha)^E1 *(\cos(omega)^E2 + A4);
                        y = g(z) \sin(alpha)^E1 *(\cos(omega)^E2 + A4);
                        z = A3 * sin(omega)^E2;
                              f(z) = A1 * (1 - K1 * x / A3); and
                              g(z) = A2 * (1 - K2 * z / A3)"))
```

No relations were defined but 25 functions defined as follows:

- A1, A2, A3, A4, K1, K2 as function that returns the values of the parameters of the superquadrics.
- -Descriptor functions, that represents the Descriptor Ontology:

Descriptor	Formal representation							
Flat	$a_i < min(a_j, a_k)/3; i \neq j \neq k$							
Holed (top-bottom)	a ₄ > 1.0							
Long	$ a_i - a_j < \Delta a; \max(a_i, a_j) < a_k < \min(2a_i, 2a_j); i \neq j \neq k$							
Round latitude	$ e_2 - 1.0 < \Delta_e$							
Round longitude	$ e_I - 1.0 < \Delta_e$							
Short	$ a_i - a_j < \Delta a; a_k < min(a_i, a_i); i \neq j \neq k$							
Similar scale parameters	$\begin{aligned} a_i - aj &< \Delta a; \ a_k < min(a_i, a_j); \ i \neq j \neq k \\ e_2 - 1.0 &< \Delta_e; \ i \neq j \end{aligned}$							
Squared latitude	$ e_2 < \Delta_e$							
Squared longitude	$ e_2 < \Delta_{\rho}$							
Tall	$ a_i - a_i < \Delta a; \max(a_1, a_2) < a_3 < \min(2a_1, 2a_2)$							
Tapered top	$0 < k_2 \le 1$ or $0 < k_1 \le 1$							
Very long	$ a_i - a_j < \Delta a; \ a_i \ge 2a_k, \ i \ne j \ne k; \ i, j = 1, 2$							
Very tall	$ a_i - a_i < \Delta a$; $a3 \ge min(2a_1, 2a_2)$							

Table 1. Descriptor ontology, where i, j, k = 1, 2, 3; $\Delta e = 0.3$; $\Delta a = 1/30 \sum_{m=1}^{3} a_m$

Here is a list of all the boolean functions that are axioms of the class Sq-Parametric-Model as shown it Table 1:

Has-Hole Has-Round-Latitude
Has-Round-Longitude Has-Sharp-Top
Has-Sharpened-Side-1 Has-Sharpened-Side-2
Has-Similar-Scale-Parameters Has-Square-Latitude
Is-Flat

Is-Long Is-Short
Is-Tall Is-Tapered-Top-E-W

Is-Tapered-Top-N-S Is-Very-Long

Is-Very-Tall

Even if these functions are part of the 3-D-Parametric-Models ontology they actually are the Descriptor Ontology (a task ontology) shown in the ontology hierarchy. It also important to point out, due to impact on higher level ontology, that these functions are not strictly defined in terms of the parameters but they also include ranges of tolerance that later allows approximation in formal shape descriptions.

3.2. 3-D-Shapes

This ontology is for defining 3-D Shapes either simple primitives of complex shapes, independent of their graphical representation. It gives semantics to graphical objects than can be part of a system.

3d-Shapes includes the following ontologies

3d-Parametric-Models /* Representation Dependent */
Component-Assemblies /* Included as part of an integration experiment

Class hierarchy (15 classes defined):

* 3d-Geometric-Primitive

ConeCubePyramidShpereCylinderCylindrical-RodRectangular-RodUnknownCylindrical-TubeDiskRectangular-SheetHoopIngotRectangular-Tube

* 3d-Complex-Shape /* To be used further at the knowledge level */

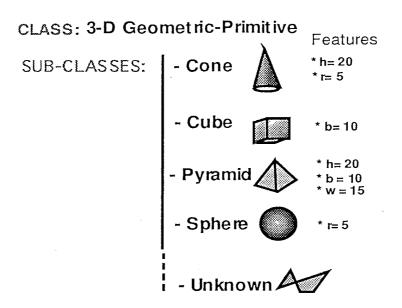


Figure 4. 3-D PrimitiveShape ontology. Based on the so called "Platonic Shapes" and some other basic topological shapes.

It is important to point out that intrinsic attributes of simple shapes, such as the radio of a Sphere, is declared in this ontology as independent from the geometric representation but its calculated and extracted from the parameters of the graphical representation.

Axioms of this ontology follows the rules stated in the following table:

© Condition holds true Implicit false or nonapplicable Condition holds false Some primitive descriptors	Cone	Cube	Cylinder	Cylindrical rod	Cylindrical tube	Disk	Hoop	Ingot	Pyramid	Rectangular rod	Rectangular sheet	Rectangular tube	Sphere
Flat		_	_		_			_	_	_	(2)	_	
Holed (top-bottom)		***			0		⊚	***	***			0	
Long		_	_		-	ı	1	0	-	_	_		I
Round latitude			0	0	0	0	0	_	_	_	_	_	0
Round longitude		_	-	_	-		_	_	_	_	_	_	0
Short				_	—	0	0	_	_	_	-	-	
Similar scale parameters		(3)	_	_	_	I	_	_			_	_	0
Squared latitude		©	_		_	_		0	0	®	©	0	_
Squared longitude		®	0	0	0	©	0	0	0	©	0	0	_
Tall			⊚	_	I		_	_	0	_	_	-	-
Tapered top									0				
Very long		_	_	_	_		_	_	_	0	_	_	-
Very tall		-	_	0	0		_	_	_	-		0	_

Table 2. Basic 3-D primitive shape ontology based on descriptors

For the *classification* of a primitive 3-D shape (an object of the class Sq-Parametric-Model) the boolean functions for the descriptors are used. Note that through out these functions independence of the underlying geometric representation is achieved. This ontology of shapes is not intended to be exhaustive by any means. On the contrary they are given with the intention of allowing further definition of other shapes.

We have then created, in Ontolingua, two extendable ontologies: the Sq-Parametric-Model ontology and the 3d-Shape ontology. The former one used for the shape's parametric representation and their description through dimensional adjectives, and the later corresponds to the geometric primitive shape ontology, also described in the ontology hierarchy (figure 2). These are the results of formalizing and re-designing the preexistent two-level rule based system (adjectives and shapes) into well defined ontologies. We have also achieved through them graphical representation independence, being able to build the next level of the knowledge representation with primitive 3-D shapes and some of their known attributes, as addressed in visual knowledge common sense, without having to deal with their underlying graphical representation.

4. Knowledge Level Ontology

The knowledge level is the closest to that of human representation of 3-D shapes. Based on primitive shapes as components and relations between these components (symbol level ontology), we can think of an intuitive way of building more complex 3-D shapes as meaningful objects in terms of the common sense that this shape reflects. The final goal is to apply this constructive paradigm to as may domains as possible. This immediately recalls the need for the computer to learn new concepts. One of the limitations of the formalization described in previous sections is that it requires much effort to formalize all sort of common sense shapes. For this reason it becomes necessary to automate or semi-automate the formalization process. Basically this can be achieved either by machine learning techniques or by knowledge sharing and reuse. While a machine learning algorithm, named *Protos*, was evaluated and modified for suiting our problem, knowledge sharing and reuse is left as further discussion. We also give an example of how a complex object ontology can be created using the modified Protos algorithm. The shape modification ontology that will enable shape deformation in terms of conceptualized transformations, using language and gestures, is also in the discussion section.

4.1. Knowledge Acquisition

To employ case based reasoning (CBR) for interactive on-line learning new complex shapes seemed adequate and was demonstrated by evaluating and modifying of Protos algorithm. The off-line learning by data presented to the computer, although not discussed in this report, can be achieved by using ID3 [12], Explanation-Based Learning (EBL) [13] or any other generalization-based method, but is has been shown [14] that these methods are not likely to perform as well as exemplar-based methods in domains with weak theories. We have chosen exemplar-based methods which are a specialization of case based reasoning, because we are dealing with weak theories.

4.1.1 Protos Algorithm and Modification

Protos is a machine learning program which acquires knowledge for performing heuristic classifications. The program learns by the by-product of performing classification under guidance of a human teacher. When presented with a case to be classified, Protos classifies the case by recalling an appropriate previous case and explaining its similarity to the new case. If classification fails, the teacher is asked to supply an explanation. By learning from explanations in addition to examples, Protos is able to classify from little training and to justify its conclusions. It is considered a *case-based* or *exemplar-based* classification system -- it takes input in the form of a new *case* and then tries to find a similar past case that was retained as an *exemplar* of a particular category/concept. Its output is the category (i.e., the classification of the case), accompanied by the specific exemplar and a set of explanations of how the features of the case are similar to the features of the exemplar. Here is the general Protos algorithm:

Given:

a set of exemplar-based categories $C = \{c_1, c_2, ..., c_n\}$ and a case (NewCase) to classify.

REPEAT

Classify:

FIND an exemplar of c, belonging to C that STRONGLY MATCHES NewCase and classify NewCase as c, EXPLAIN the classification.

Learn:

IF the expert disagrees with the classification of explanation THEN

acquire classification and explanation knowledge and ADJUST C so that NewCase is correctly classified and explained.

UNTIL the expert approves the classification and explanation.

For explaining exactly where the modification of the algorithm occurred a more detailed explanation about Protos and how it works follows .

Protos learns about four things -- features, exemplars, categories, and relations -- from the teacher (Protos also autonomously learns indexing and featural importance). Let's examine each of these.

- * Features are terms used to describe a case. For example, I could describe a the case "1994 western house" with the following features: roof, walls, chimney, TV_antenna, (doors 2), garage, garden and (windows 4). Obviously, a feature can be in the form of a proposition or a predicate with arguments.
- * An exemplar is a case which Protos has processed and retained. An exemplar is an instance of a concept. For example, the exemplar "1994 Western House" is an instance of the concept "house".
- * A category is a collection of instances of a concept. The category "house" might consist of the exemplars "1994 Western House", "1889 Japanese House", and "1966 Muscovite House".
- *Relations are learned from explanations. For example, Protos will ask what the relevance of "door" is to "house". The teacher might respond with the explanation "door has function entrance is part of house". From this, Protos installs two relations in its knowledge base: "door has function entrance" and "entrance is part of house".

The efficient use of exemplars during classification requires that they be indexed so that they can be efficiently retrieved when they are likely to be similar to a new case. Now we should describe how Protos learns four type of indices -- remindings, censors, prototypicality, and difference links.

- 1) Remindings are initially learned from feature-to-category explanations given by the teacher when a new exemplar is added to the category network. For example, when the teacher explains that entrance is part of house Protos learns a reminding from entrance to house The strength of a reminding estimates p(C/f), the probability of the classification given the feature. This strength comes from the strength of the explanation.
- 2) Censors are negative remindings, i.e., an index to the category network saying that the presence of a certain feature tends to rule out a given classification.

- 3) The *prototypicality* of an exemplar is a measure of how typical the exemplar is of the category. Every time that an exemplar is successfully used in matching a new case, its prototypicality is automatically increased.
- 4) Protos learns difference links as a result of a "near miss" matches during classification. It connects two exemplars (in the same or different categories) and indicates important features which discriminate between the two.

Having mentioned the important concepts, now a more detailed Protos algorithm for using and learning indexing knowledge will be presented, in order to focalize the modified part.

GIVEN: a case (NewCase) to classify.

To find an exemplar matching NewCase:

- 1 Collect remindings from New Case's features to categories.
- 2 Combine remindings to related categories (**)
- Retain the N categories with the strongest combined remindings.
- 4 Select, in order of **prototypicality**, several exemplars of each category.
- 5 Collect **remindings** from *NewCase's* features to exemplars, and add these to list of exemplars. Order the list by reminding strength.
 - REPEAT (consider the exemplars in decreasing order)
- 6 Let Exemplar1 be the exemplar with the next highest reminding strength.
- 7 Determine the similarity of NewCase and Exemplar1.

UNTIL a sufficiently strong match is found.

8 Use **exemplar differences** from *Exemplar1* to locate a better match (*Exemplar2*).

Exemplar2's category is used to classify NewCase and the match between Exemplar2 and NewCase is used to explain this classification. Indexing knowledge is acquired by discussing this classification and explanation with the expert as follows.

- IF the expert rejects the classification or explanation
 THEN Reassess the **remindings** from *NewCase*'s features.
 ELSE (the expert accepts the classification and explanation)
- 10 Increase protopypicality of Exemplar2.
 - IF NewCase is retained as an exemplar
- 11 THEN Learn remindings for NewCase. (*)
 - IF NewCase was initially classified or explained

incorrectly

12 THEN record exemplar differences.

Steps 1 through 8 describes how Protos uses indexing knowledge to find an exemplar matching a given case. Steps 9 through 12 describes how Protos acquires indexing knowledge. The point that was directly modified was step 11 (*), i.e., the core process of learning remindings. This affects the overall learning process and it is reflected mostly in step 2 (**) in the matching part of the algorithm.

The major modification was due to the fact that in the process of learning a reminding by compiling an expert-supplied explanation of a case feature, Protos heuristically analyzes each explanation to determine the category or exemplar to which the reminding should refer and the strength of the reminding. That means that it chooses only one category of the network to which refer the reminding. Although this simplifies the algorithm it leaves out the possibility of propagating the reminding though the category network that is an important

aspect to include in order to accelerate learning and minimize misses. This is clearly evident in part-whole and generalization-specialization relations that are much of our concern. Say for example, that the following expanation is presented to Protos:

prism suggests roof witch is part of house

Protos would then prompt asking to which one and only one of the categories involved (roof or house) should be referred the reminding from the feature prism. We have found that assigning the reminding to only one category produces inconsistencies and many errors at the hypothesis formation time for classification since the hypothetical categories are only drawn based on the reminders. If we choose only to refer the reminding from prism to roof then if later, we present a more complex case, say a prism and a cube, it would be considered as a roof without even listing among the categories candidates for classification, the correct one, i.e., a house.

Therefore the modification consisted in the propagation of remindings through the category network creating remindings not only to the main category target but also to its relatives (inferred from part-whole and generalization -specialization relations). The strength of the reminders are weakened towards more higher hierarchies. In case of the explanation given as example, a *strong* reminder will be created between *prism* and *roof*, but also a less stronger reminder will be established between *prism* and the category *house* enabling a more accurate list of hypothesis for faster and better learning.

4..2. Complex Object Ontology through an example

House ontology obtained by using Protos.

Category Structure

----- specialization

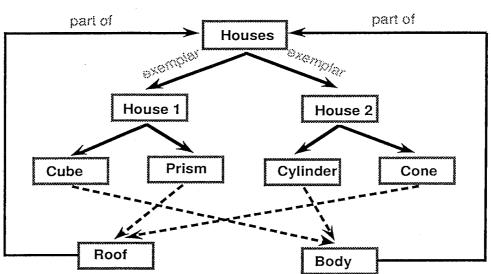


Figure 4. Partial description of the category network obtained when building a simple house ontology with modified Protos.

We have built an experimental simple house ontology (only considering the part-whole relations of the complex objects), with the help of the modified Protos program. We now present part of the outputted knowledge base that can serve as basis for constructing the formal ontology. It was generated in Common Lisp and, once the features and learningmechanism of Protos is understood, its comprehension is straight forward.

```
(term :name house
     :importances ((story 2 0.70) (rectangular sheet 0.34)
```

```
(semi-cylinder 0.34)
                    (square base pyramid 0.34) (cylinder 0.34) (cone 0.34)
                    (cube 0.95) (prism 0.78) (roof 0.70)
                    (walls 0.70))
                   (proto house humble house dome house indian house
      :exemplars
                    small house two story house)
                   (((house has part roof) "Joaquin" "A roof is part
      :relations
                      of a house")
                    ((house has function (shelter person)) "Joaquin"
                 "A house has the function of shelter for persons")
                    ((house has part walls) "Joaquin" "walls are part of
                      a house ")))
                   proto house
(term :name
                   "A general abstract house "
     :comment
                   house
      :category
                   (walls roof)
      :features
     :typicality 6.50)
                   walls
(term :name
      :remindings ((house 0.67))
      :importances ((cylinder 0.48) (cube 0.48))
      :exemplars (walls1 walls2)
      :relations
                   (((walls equivalent story 2) "joaquin"
                 "Story 2 are walls of the second floor")
                    ((walls equivalent story 1) "joaquin"
                 "Story 1 are the walls of the first floor")
                    ((walls is part of house) "Joaquin" "Walls are
                      part of a house ")
                    ((walls sometimes is inferred from cube) "Joaquin"
                 "A cube suggest a house's base because of it's form.")
                    ((walls sometimes is inferred from cylinder) "Joaquin"
                 "A cylinder suggest a base of a house because of
                  it's form.")))
                   roof
(term :name
     :remindings ((house 0.70))
      :importances ((triangle_base_pyramid 0.48)
                    (rectangular sheet 0.48)
                    (semi-cylinder 0.48) (square base pyramid 0.48)
                    (cone 0.48) (prism 0.48))
                   (proto roof roof5 roof2 roof1 roof3 roof4)
     :exemplars
     :relations
                   (((roof is part of house) "Joaquin" "A roof is part
                 of a house")
                    ((roof sometimes is inferred from prism) "Joaquin"
                 "A prism always suggest a roof because of its form")
                    ((roof sometimes is inferred from cone) "Joaquin"
                 "Cone sometimes suggest roof because of it's form")
                    ((roof sometimes is inferred from square base pyramid)
                  "Joaquin"
                 "A square base pyramid suggest roof because of it's form")
                    ((roof sometimes is inferred from semi-cylinder)
                  "Joaquin"
                 "A semi cylinder suggest roof because of it's form")
                    ((roof sometimes is inferred from rectangular sheet)
                  "Joaquin"
                 "A rectangular sheet suggest roof because it's form")
                    ((roof sometimes is inferred from
                 triangle_base_pyramid) "Joaquin"
                 "A triangle base pyramid suggest roof because of
                 it's form"))) ...
```

Even if a generic house (proto_house) is considered to be composed of roof and walls, we have two more shape dependent exemplars, the small_house and the indian_house. While the small_house is composed if a prism and a cube (as prism is an exemplar of roof and cube an exemplar of walls), the indian_house or hut (*) is composed of a cylinder and a cone (in the same way exemplars of roof and walls).

(*) Protos also allows the definitions of *synonyms* of terms, that is very convenient as we may need to refer to the same term with different names, for example, a *cube* could also be called a *box*..

In this section we have discussed why is it necessary to automate the knowledge acquisition process of formalizing 3-D common sense shapes, and we have also shown the modifications made to a machine learning program called *Protos* for such purpose. In addition, a simple house ontology is described as a experimental result of using this modified program for learning about combinations of primitive shapes than can somehow, describe the shape of a house.

5. Discussion

5.1. Component-Relation Ontology

According to Lang's proposal [15]:

- a) Knowledge of shape is object-centered and based on axes of symmetry.
- b) Knowledge of orientation is based on the relation of the object-centered axial system to the axes of local space.
- c) The axes of local space consists of the vertical axis (determined by gravity) and the observer's line of sight.

Now merged with these concepts, first we had adopted the "Position-Orientation" theory for representing the relations between two primitives, at the geometric representation level, as two pairs of vectors, where each pair represents the general position and the orientation of a primitive component in space, in respect to the local space coordinates. The local space of the complex object is defined as for the bounding box that covers all the components. This although quite straightforward was not sufficient for building a case of a complex 3-D shapes for learning purpose.

Based on this and other analyses, we have reached the following conclusions:

- Definitions of complex objects has to be user's view point dependent.
- Definitions of complex objects, within a range, should be scale independent. For example, no matter if it's big or small, a shape of house should be identified as a house.
- A hierarchy of objects (components) has to be drawn and relations between them should be stated in a logic predicate form. This enables intelligent processing and learning at the knowledge level. Numerical constraints that truly holds the relations expressed through the position and orientation of each component, are verified only at the lowest level and only when it's needed.

Directional Propositions:

```
above(X,Y), below(Y,X)

in_tront_of(X,Y), behind(Y,X)

to_the_left_of(X,Y), to_the_right_of(Y,X)
```

Connectional Propositions:

touches(X,Y)
does_not_touch(X,Y)

Predicates of Position

lying(X), standing(X)

upside_down(X)

backwards(X)



Figure 5. Partial description of a proposed Component-Relation Ontology

One of the problems that arises with the model of component-relation ontology, shown in figure 5, is to define well the "touches" or "connected_with" relations between primitive shapes. Bearing the predicates of position for each component and the directional propositions that establishes spatial relations between the components, where and how do two shapes touch can be important information when learning about complex shapes.

At this first glance we could use elements of the primitive shapes, such as faces, edges, vertices and other properties such as radius, height, etc..., that can be useful for establishing such relations and can be defined in the 3d-Shape ontology. Each geometric primitive could have "slots" corresponding to elements that belongs to them. In that sense we give the following examples:

- Pyramid:- (Rectangular_face(base), Triangle_face(t1,t2,t3,t4),

Edge(e1, e2, e3, e4, e5, e6, e7, e8), Vertex(top, v1, v2, v3, v4),

Scalar(hight))

- Cube:- (Rectangular_face(top, bottom,l eft, right, front, rear),

Edge(e1,...,e12), Vertex(v1,v2,...,v8), Scalar (hight, length, width))

- Sphere:- (Scalar(radius), Curve_surface(body))

-Cylinder:- (Circular_face(top, bottom), Curve_surface(body),

Scalar(inner_radius, outer_radius))

- Hoop:- (Circular_face(top,bottom),Curve_surface(body),

Scalar(inner_radius, outer_radius, Circular_hole(hole))

Taking this into account the exemplar of "house" in figure 5, would be redefined as:

House(P, C) = Pyramid(P) and Cube(C) and P.base "connected_to" C.top and standing(P)

and above(P,C)

Cases then will be represented as a group of features predicates and propositions that describe relations between these features giving a more qualitative description of the world. If quantitative descriptions become necessary they could be included in the description in form of predicates and can eventually be transformed into qualitative descriptions or left as

numeric ones that can be suitable for a precise description of an exemplar.

Further research has to be done in order to build a well defined component-relation ontology but we do believe that this approach could give some insights in achieving it.

5.2. Knowledge Share & Reuse

```
Thing ...
Simple-Geometry ...
Component-Assemblies
Dme-Cml ...
Components-With-Constraints
Mace-Domain
Vt-Design ...
Mechanical-Components ...

3d-Parametric-Models
3d-Shapes
houses
cars
furniture
```

Figure 6. Ontology Lattice

As analized by Simmons in [16], this interesting question arise: what are the prospects for developing re-usable ("generic") ontologies of objects that encode knowledge of characteristic shapes for natural language processing and virtual environments? Biederman [17], estimates that there are about 3,000 identifiable and easily distinguishable basic level object categories in the cognitive and linguistic repertoire of typical adults, and that there may be as many as 10 geometric types for each category, yielding about 30,000 shapes that each of us knows about (he suspects that this estimate may be too large in about one order of magnitude). Many of these 3,000 categories overlap between individuals, but some of them correspond to idiosyncratic knowledge stemming from personal experience and expertise: an architect, for example, can distinguish a wide variety of roof shapes that all look the same to the rest of us. Leaving besides the fact that idiosyncratic categories such as house roofs may be very important for many practical AI applications; thus the size of a truly generic ontology of object shapes that would be of interest to many projects may be one order of magnitude larger than Biederman's estimate: on the order of a hundred thousand object categories.

Assembling an object taxonomy that large by hand would be a horrendous project, possibly taking as much as decades to complete. But there are numbers of ways the problem can be reduced some of them already addressed in this report. One would be to structure a generic ontology as hierarchy of useful sub-ontologies, such as a taxonomy of roof shapes. This is the top-down approach, adopted by the Cyc project [18] for building a huge "common sense" ontology. The other is to allow users to build ontologies in a more independent way, that later could be integrated, in a bottom-up fashion. For that purpose an ontology integration tool is needed, striving for commitment, called ontological commitment by Gruber [2], on the definitions of terms that want to be shared by different systems. This is the Ontolingua's approach, that can also be used as a powerful tool for building ontologies in a cooperative way, even for agent systems purpose. As shown in figure 6, our ontologies Sq-Parametric-Models and 3-d-Shapes could be (at least in theory) integrated in a more wide ontology lattice that Ontolingua offers as an ontology library. But even then, it would not be efficient to build a shape ontology by hand; using a learning algorithm that matches the performance of human beings, is surely a better approach. Although not consider to match the performance of a human being, *Protos* has shown, by experiments in the medical audiology domain, to be quite accurate (98 %). The modification proposed in this report gives more power to its

learning process and allows Protos to handle more efficiently "part-of" and "generalization-specialization" category hierarchies suitable to the shape ontology problem. We believe that it will not be long until we could teach the computer the shape of a house, just building one out of primitive shapes, or maybe inputting it as a picture, and say, "This is a house".

5.3. Shape Modification Ontology

In order to add knowledge to the computer that not only contains the common sense knowledge that these shapes reflect, but also shape knowledge about possible transformations of such objects, a modification ontology has to be created at the knowledge level. Based on adjectives (dimensional, functional, of form, ..., etc.; some of them already part of the description ontology at the symbol level) we can think of verbal derivative, such as lengthen, shorten, rounded, straighten, etc., that can serve as basis for more complex transformations of 3-D shapes. Say, for example, that we want to make a house more modern. This desired transformation could have several underling adjectives related to the concept modern, in the house domain, that can indicate what type of shape modification has to be performed. Say an architect defines a modern house to be simple, with more horizontal lines, open to the exteriors, etc. This is indeed difficult to conceptualize, but based on the exemplar model, we have thought of two approaches, at lower level, that might lead us to achieve the desired goal. Let's give an example for better illustrating these two approaches: Having a prototypical exemplar of an old style Japanese house A and other prototypical exemplar of a modern Japanese house B and the transformation A ~ B, meaning "make A more modern", then:

- 1) The Parameter Interpolation approach: The parameters of the geometric model (say supercuadrics) underling both shapes A and B, are interpolated resulting in another shape C, that will have both characteristics of A and B. C can be considered either a "modernized old Japanese house" or a "old fashioned modern Japanese house".
- 2) The Genetic Algorithm approach: This is similar to the previous approach but rather than interpolating the parameters, a GA algorithm can be used to produce an offspring C of the parents A and B rather more accurate in terms of inherited qualities. Different weights could be given to the genetic combination to reflect qualifications such as "more", "less", "very", 'barely", etc. in transformations such as "make A more modern".

5.4. Proposed System Architecture

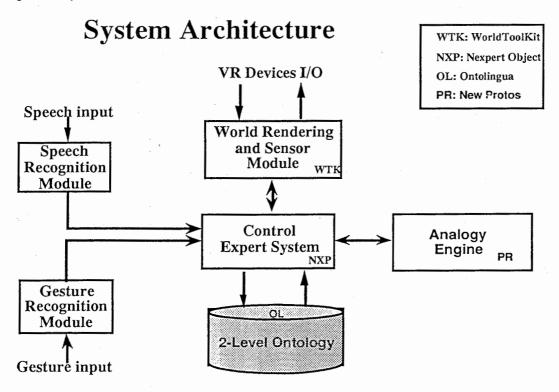


Figure 7. Proposed System Architecture

Towards an actual implementation of a prototype for the *intuitive to use* virtual environment, this new system architecture was proposed as the result of this research.

6. Concluding Remarks

- * We have constructed a simple ontology of 3-D shapes and subjectively came to the conclusion that adding common sense knowledge to virtual objects is possible due to the 2-Level Ontology approach.
- * We evaluated whether Case-Based Reasoning can be used to acquire such knowledge. Demonstrated with simple cases of houses that this can be done. Though further integration has to be made between the case-based reasoning system and Ontolingua.

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Appendix A

Ontologies in Ontolingua

This appendix summarizes the ontologies 3D-PARAMETRIC-MODELS and 3D-SHAPES, built with the help of an ontology editing tool called *Ontolingua*. The Knowledge Sharing Laboratory (KSL) at Stanford University, offers this tool as an interactive online service on the World Wide Web for cooperative creation and edition of "portable" ontologies, also being able to serve as an ontology library. Among the things it offers we can mention the automatic translations of ontologies into several knowledge representation languages and systems, and the consistency checking between its primitives for creating and editing such ontologies, - -classes, relations, functions, and object constants-- proved to be very usefull. It can be found in the WWW at http://www-ksl-svc.stanford.edu:5915/.

Ontology 3D-PARAMETRIC-MODELS

```
(In-Package "ONTOLINGUA-USER")
;;; Written by user Jdelgado from session "test" owned by group JUST-ME
;;; Date: Aug 31, 1995 19:15
 (Define-Ontology
     3d-Parametric-Models
      (Frame-Ontology)
   "An ontology of 3d solid models for Computer Graphics"
   :Io-Package
   "ONTOLINGUA-USER"
   :Intern-In
   ((Kif-Meta Logconst)
    (Kif-Numbers Positive Real-Number Min < > Number Max * >= + / - Abs =<)
    (Kif-Relations Function Binary-Relation) (Kif-Sets True)))
(In-Ontology (Quote 3d-Parametric-Models))
;;; ------ Classes -----
;;; Sq-Parametric-Model
(Define-Frame Sq-Parametric-Model
              :Own-Slots
              ((Arity 1)
               (Documentation
                "This is a 3d solid math model based on a parameter space")
               (Instance-Of Class) (Subclass-Of Thing))
              :Template-Slots
               ((A1 1 (Slot-Value-Type Real-Number))
               (A2 1 (Slot-Value-Type Real-Number))
               (A3 1 (Slot-Value-Type Real-Number))
               (A4 0 (Slot-Value-Type Real-Number))
```

```
(E1 1 (Slot-Value-Type Positive))
               (E2 1 (Slot-Value-Type Positive))
               (K1 0 (Slot-Value-Type Real-Number))
               (K2 0 (Slot-Value-Type Real-Number)))
              :Issues
              ((:Source
                "The definition of the superquadrics model is given by
Hirikoshi, as follows:
          x = f(z) \cos(alpha)^E1 *(\cos(omega)^E2 + A4);
          y = g(z) \sin(alpha)^E1 *(\cos(omega)^E2 + A4);
          z = A3 * sin(omega)^E2;
          where, f(z) = A1 * (1 - K1 * x / A3); and
                 g(z) = A2 * (1 - K2 * z / A3)")))
;;; ----- Relations -----
;;; ------ Functions ------
;;; A1
(Define-Function A1
                 (?Frame)
                 :->
                 ?Value
                 "Scale on the X axis"
                 :Def
                 (And (Sq-Parametric-Model ?Frame) (Number ?Value)))
;;; A2
(Define-Function A2
                 (?Frame)
                 :->
                 ?Value
                 "Scale on the X axis"
                 (And (Sq-Parametric-Model ?Frame) (Number ?Value))
                 :Documentation
                 "Scale on the Y axis")
;;; A3
(Define-Function A3
                 (?Frame)
                 :->
                 ?Value
                 "Scale on the X axis"
                 (And (Sq-Parametric-Model ?Frame) (Number ?Value))
                 :Documentation
                 "Scale on the Z axis")
```

;;; A4

```
(Define-Frame A4
               :Own-Slots
               ((Arity 2)
                (Documentation "'expansion' radius factor; >1.0 for
toroidal")
                (Domain Sq-Parametric-Model)
                (Instance-Of Binary-Relation Function) (Range Number)))
;;; E1
(Define-Frame E1
               :Own-Slots
               ((Arity 2)
                (Documentation "east/west deformation exponential
(positive)")
                (Domain Sq-Parametric-Model)
                (Instance-Of Binary-Relation Function) (Range Number))
               :Issues
               ((:Example "E1 < 1.0 makes square corners;
E1 = 1.0 makes smooth circles;
E1 > 1.0 makes hyperbolics slopes")))
;;; E2
(Define-Frame E2
               :Own-Slots
               ((Arity 2)
                (Documentation
                 "north/south deformation exponential (positive)")
                (Domain Sq-Parametric-Model)
                (Instance-Of Binary-Relation Function) (Range Number)))
;;; Has-Hole
(Define-Frame Has-Hole
               :Own-Slots
               ((Arity 2)
                (Documentation "Determines if a supercuadric is \(\frac{1}{2}\)" holed\(\frac{1}{2}\)
".")
                (Domain Sq-Parametric-Model)
                (Instance-Of Binary-Relation Function) (Range Logconst))
               :Axioms
               ((<=> (Has-Hole ?X True) (> (Abs (A4 ?X)) 1.0))))
;;; Has-Round-Latitude
(Define-Frame Has-Round-Latitude
               :Own-Slots
               ((Arity 2)
                (Documentation
                 "Determines if a supercuadric has \(\frac{1}{2}\)"round latitude\(\frac{1}{2}\)".")
                (Domain Sq-Parametric-Model)
                (Instance-Of Binary-Relation Function) (Range Logconst))
               :Axioms
               ((=> (Has-Round-Latitude ?X)
                 (<=> (Has-Round-Latitude ?X True)
                  (=< (Abs (- (E2 ?X) 1.0)) 0.3)))))
```

```
;;; Has-Round-Longitude
(Define-Frame Has-Round-Longitude
                :Own-Slots
                ((Arity 2)
                 (Documentation
                  "Determines if a supercuadric has \(\frac{1}{2}\)"round longitude\(\frac{1}{2}\)".")
                 (Domain Sq-Parametric-Model)
                 (Instance-Of Binary-Relation Function) (Range Logconst))
                :Axioms
                ((=> (Has-Round-Longitude ?X)
                  (<=> (Has-Round-Longitude ?X True)
                   (=< (Abs (- (E1 ?X) 1.0)) 0.3)))))
;;; Has-Sharp-Top
(Define-Frame Has-Sharp-Top
                :Own-Slots
                ((Arity 2)
                 (Documentation
                  "Determines if a supercuadric is \(\frac{1}{2}\)"sharp\(\frac{1}{2}\)" pointed.")
                 (Domain Sq-Parametric-Model)
                 (Instance-Of Binary-Relation Function) (Range Logconst))
                :Axioms
                ((<=> (Has-Sharp-Top ?X True)
                  (And (Has-Sharpened-Side-1 ?X True)
                   (Has-Sharpened-Side-2 ?X True)))))
;;; Has-Sharpened-Side-1
(Define-Frame Has-Sharpened-Side-1
                :Own-Slots
                ((Arity 2)
                 (Documentation
                  "Determines if a supercuadric has one side \( \frac{1}{2} \) "sharp\( \frac{1}{2} \)".")
                 (Domain Sq-Parametric-Model)
                 (Instance-Of Binary-Relation Function) (Range Logconst))
                ((<=> (Has-Sharpened-Side-1 ?X True)
                  (=< (Abs (- (K1 ?X) 1)) 0.1))))
;;; Has-Sharpened-Side-2
(Define-Frame Has-Sharpened-Side-2
                :Own-Slots
                ((Arity 2) (Domain Sq-Parametric-Model)
                 (Instance-Of Binary-Relation Function) (Range Logconst))
                ((<=> (Has-Sharpened-Side-2 ?X True)
                  (=< (Abs (- (K2 ?X) 1)) 0.1)))
                :Documentation
                "Determines if a supercuadric has one side \(\frac{1}{2}\)"sharp\(\frac{1}{2}\)".")
```

;;; Has-Similar-Scale-Parameters

```
(Define-Frame Has-Similar-Scale-Parameters
               :Own-Slots
               ((Arity 2)
                (Documentation
                 \tilde{\ } "It's true if the supercuadric has \mathbf{Y} "similar scale
parameters.")
                (Domain Sq-Parametric-Model)
                (Instance-Of Binary-Relation Function) (Range Logconst))
               :Axioms
               ((<=> (Has-Similar-Scale-Parameters ?X True)
                 (And
                  (=< (Abs (- (A1 ?X) (A2 ?X)))
                   (/ (+ (A1 ?X) (A2 ?X) (A3 ?X)) 30))
                  (=< (Abs (- (A1 ?X) (A3 ?X)))
                   (/ (+ (A1 ?X) (A2 ?X) (A3 ?X)) 30))
                  (=< (Abs (- (A2 ?X) (A3 ?X)))
                   (/ (+ (A1 ?X) (A2 ?X) (A3 ?X)) 30))))))
;;; Has-Square-Latitude
(Define-Frame Has-Square-Latitude
               :Own-Slots
               ((Arity 2)
                (Documentation
                 "Determines if a supercuadric has \(\frac{1}{2}\)"square latitude\(\frac{1}{2}\)".")
                (Domain Sq-Parametric-Model)
                (Instance-Of Binary-Relation Function) (Range Logconst))
               :Axioms
               ((<=> (Has-Square-Latitude ?X True) (=< (Abs (E2 ?X)) 0.3))))
;;; Has-Square-Longitude
(Define-Frame Has-Square-Longitude
               :Own-Slots
               ((Arity 2)
                (Documentation
                 "Determines if a supercuadric has \(\frac{1}{2}\)"square longitude\(\frac{1}{2}\)".")
                (Domain Sq-Parametric-Model)
                (Instance-Of Binary-Relation Function) (Range Logconst))
               ((=> (Has-Square-Longitude ?X)
                 (<=> (Has-Square-Longitude ?X True) (=< (Abs (E1 ?X))
0.3)))))
;;; Is-Flat
(Define-Frame Is-Flat
               :Own-Slots
               ((Arity 2)
                (Documentation
                 "Determines if a supercuadric is considered \(\frac{1}{2}\)" ")
                (Domain Sq-Parametric-Model)
                (Instance-Of Binary-Relation Function) (Range Logconst))
               :Axioms
               ((<=> (Is-Flat ?X True)
                 (Or
                  (And (< (A3 ?X) (Min (A1 ?X) (A2 ?X)))
                   (< (A3 ?X) (/ (Min (A1 ?X) (A2 ?X)) 3)))
```

```
(And (< (A2 ?X) (Min (A1 ?X) (A3 ?X)))
                   (< (A2 ?X) (/ (Min (A1 ?X) (A3 ?X)) 3)))
                  (And (< (A1 ?X) (Min (A2 ?X) (A3 ?X)))
                   (< (A1 ?X) (/ (Min (A2 ?X) (A3 ?X)) 3)))))))
;;; Is-Long
(Define-Frame Is-Long
               :Own-Slots
               ((Arity 2)
                (Documentation "Determines if a supercuadrics is \u214"long\u224
".")
                (Domain Sq-Parametric-Model)
                (Instance-Of Binary-Relation Function) (Range Logconst))
               :Axioms
               ((<=> (Is-Long ?X True)
                 (Or
                  (And
                   (=< (Abs (- (A1 ?X) (A2 ?X)))
                    (/ (+ (A1 ?X) (A2 ?X) (A3 ?X)) 30))
                   (> (A3 ?X) (Max (A1 ?X) (A2 ?X)))
                   (< (A3 ?X) (* 2 (Min (A1 ?X) (A2 ?X)))))
                  (And
                   (=< (Abs (- (A1 ?X) (A3 ?X)))
                    (/ (+ (A1 ?X) (A2 ?X) (A3 ?X)) 30))
                   (> (A2 ?X) (Max (A1 ?X) (A3 ?X)))
                   (< (A2 ?X) (* 2 (Min (A1 ?X) (A3 ?X)))))
                  (And
                   (=< (Abs (- (A2 ?X) (A3 ?X)))
                    (/ (+ (A1 ?X) (A2 ?X) (A3 ?X)) 30))
                   (> (A1 ?X) (Max (A2 ?X) (A3 ?X)))
                   (< (A1 ?X) (* 2 (Min (A2 ?X) (A3 ?X))))))))
;;; Is-Short
(Define-Frame Is-Short
               :Own-Slots
               ((Arity 2)
                (Documentation "Determines if a supercuadrics is \(\frac{4}{3}\)"short\(\frac{4}{3}\)
".")
                (Domain Sq-Parametric-Model)
                (Instance-Of Binary-Relation Function) (Range Logconst))
               :Axioms
               ((<=> (Is-Short ?X True)
                 (And
                  (=< (Abs (- (A1 ?X) (A2 ?X)))
                   (/ (+ (A1 ?X) (A2 ?X) (A3 ?X)) 30))
                  (< (A3 ?X) (/ (Min (A1 ?X) (A2 ?X)) 2))))))
;;; Is-Tall
(Define-Frame Is-Tall
               :Own-Slots
               ((Arity 2)
                (Documentation "Determines if a superquadrics is \(\frac{4}{3}\) tall\(\frac{4}{3}\)")
                (Domain Sq-Parametric-Model)
               (Instance-Of Binary-Relation Function) (Range Logconst))
               :Axioms
```

```
((<=> (Is-Tall ?X True)
                 (>= (Abs (- (A1 ?X) (A2 ?X)))
                  (/ (+ (A1 ?X) (A2 ?X) (A3 ?X)) 30))
                  (>= (A3 ?X) (Max (A1 ?X) (A2 ?X)))
                 (< (A3 ?X) (* 2 (Min (A1 ?X) (A2 ?X))))))))
;;; Is-Tapered-Top-E-W
(Define-Frame Is-Tapered-Top-E-W
              :Own-Slots
              ((Arity 2)
               (Documentation "Determines if a supercuadric is tapered at
the
top in East West direction.")
               (Domain Sq-Parametric-Model)
               (Instance-Of Binary-Relation Function) (Range Logconst))
              :Axioms
              ((<=> (Is-Tapered-Top-E-W ?X True)
                (And (=< (K2 ?X) 1.0) (> (K2 ?X) 0.0)))))
;;; Is-Tapered-Top-N-S
(Define-Frame Is-Tapered-Top-N-S
              :Own-Slots
              ((Arity 2)
               (Documentation "Determines if a supercuadric is tapered at
top in North-South direction.")
               (Domain Sq-Parametric-Model)
               (Instance-Of Binary-Relation Function) (Range Logconst))
              :Axioms
              ((<=> (Is-Tapered-Top-N-S ?X True)
                (And (=< (K1 ?X) 1.0) (> (K1 ?X) 0.0)))))
;;; Is-Very-Long
(Define-Frame Is-Very-Long
              :Own-Slots
              ((Arity 2)
               (Documentation
                "Determines if a supercuadrics is Y"very longY".")
               (Domain Sq-Parametric-Model)
               (Instance-Of Binary-Relation Function) (Range Logconst))
              :Axioms
              ((<=> (Is-Very-Long ?X True)
                (Or (Is-Very-Tall ?X True)
                 (And
                  (=< (Abs (- (A1 ?X) (A3 ?X)))
                   (/ (+ (A1 ?X) (A2 ?X) (A3 ?X)) 30))
                  (>= (A2 ?X) (* (Max (A1 ?X) (A3 ?X)) 2)))
                 (And
                  (=< (Abs (- (A2 ?X) (A3 ?X)))
                   (/ (+ (A1 ?X) (A2 ?X) (A3 ?X)) 30))
                  (>= (A1 ?X) (* (Max (A2 ?X) (A3 ?X)) 2)))))))
```

;;; Is-Very-Tall

```
(Define-Frame Is-Very-Tall
             :Own-Slots
             ((Arity 2)
               (Documentation
               "Determines if a supercuadrics is Y"very tallY".")
               (Domain Sq-Parametric-Model)
              (Instance-Of Binary-Relation Function) (Range Logconst))
              :Axioms
              ((<=> (Is-Very-Tall ?X True)
                (And
                 (=< (Abs (- (A1 ?X) (A2 ?X)))
                 (/ (+ (A1 ?X) (A2 ?X) (A3 ?X)) 30))
                 (>= (A3 ?X) (* 2 (Max (A1 ?X) (A2 ?X))))))))
;;; K1
(Define-Frame K1
              :Own-Slots
              ((Arity 2) (Documentation "tapering factor on North/South")
               (Domain Sq-Parametric-Model)
               (Instance-Of Binary-Relation Function) (Range Number)))
;;; K2
(Define-Function K2
                (?Frame)
                :->
                ?Value
                "Scale on the X axis"
                 :Def
                (And (Sq-Parametric-Model ?Frame) (Number ?Value))
                :Documentation
                "tapering factor on East/West")
;;; ------ Instance -----
;;; ------ Axiom -----
;;; ----- Other -----
Date: Thu, 31 Aug 1995 19:16:36 -0700
To: jdelgado@atr-sw.atr.co.jp
From: KSL Network Services <Ontology-librarian@HPP.Stanford.EDU>
Subject: Ontology 3D-SHAPES
(In-Package "ONTOLINGUA-USER")
;;; Written by user Jdelgado from session "test" owned by group JUST-ME
;;; Date: Aug 31, 1995 19:16
(Define-Ontology
    3d-Shapes
     (3d-Parametric-Models Component-Assemblies)
```

```
"This ontology is for defining 3-D Shapes. It gives
semantics to graphical objects than can be part of
a complex system."
   :Io-Package
   "ONTOLINGUA-USER"
   :Intern-In
   ((Frame-Ontology Slot-Value-Type Thing Alias Subclass-Of Class Instance-Of
     Documentation Arity)
    (Kif-Numbers Number Positive) (Kif-Sets True)))
(In-Ontology (Quote 3d-Shapes))
;;; ------ Classes -----
;;; 3d-Geometric-Primitive
(Define-Class 3d-Geometric-Primitive
               ( ?X)
               "Primitive 3-D shapes."
               :Def
               (And (Thing ?X)))
;;; Cone
(Define-Frame Cone
               :Own-Slots
               ((Arity 1)
                (Documentation "The class of all shapes \(\frac{4}{3}\)" like\(\frac{4}{3}\)" cones.")
                (Instance-Of Class)
                (Subclass-Of 3d-Geometric-Primitive Sq-Parametric-Model))
               :Template-Slots
               ((Has-Round-Latitude True) (Has-Square-Longitude True)
                (Is-Tall True))
               :Axioms
               ((<=> (Cone ?X)
                 (And (Sq-Parametric-Model ?X) (Is-Tall ?X True)
                  (Has-Square-Longitude ?X True) (Has-Round-Latitude ?X
True)
                  (Has-Sharp-Top ?X True) (Not (Has-Hole ?X True))))))
;;; Cube
(Define-Frame Cube
               :Own-Slots
               ((Alias Sq-Parametric-Model) (Arity 1)
                (Documentation "The class of all shapes \(\frac{1}{2}\)" like\(\frac{1}{2}\)" cubes.")
                (Instance-Of Class)
                (Subclass-Of 3d-Geometric-Primitive Sq-Parametric-Model))
               :Template-Slots
               ((Has-Hole) (Has-Similar-Scale-Parameters True)
                (Has-Square-Latitude True) (Has-Square-Longitude True))
               :Axioms
               ((=> (Cube ?X) (Sq-Parametric-Model ?X))
                (=> (Cube ?X) (Not (Is-Tapered-Top-E-W ?X True)))
                (=> (Cube ?X) (Not (Is-Tapered-Top-N-S ?X True)))
```

```
(=> (Cube ?X) (Not (Has-Hole ?X True)))
                (<=> (Cube ?X)
                 (And (Sq-Parametric-Model ?X)
                  (Has-Similar-Scale-Parameters ?X True)
                  (Has-Square-Longitude ?X True) (Has-Square-Latitude ?X
True)
                  (Not (Is-Tapered-Top-E-W ?X True))
                  (Not (Is-Tapered-Top-N-S ?X True))
                  (Not (Has-Hole ?X True))))))
;;; Cylinder
(Define-Frame Cylinder
               :Own-Slots
               ((Arity 1)
                                                            shapes \(\frac{4}{\text{"like\frac{4}{\text{"}}}}\)
                (Documentation "The class of all
cylinders.")
                (Instance-Of Class) (Subclass-Of 3d-Geometric-Primitive))
               ((<=> (Cylinder ?X)
                 (And (Sq-Parametric-Model ?X) (Is-Tall ?X True)
                  (Has-Square-Longitude ?X True) (Has-Round-Latitude ?X
True)
                  (Not (Is-Tapered-Top-E-W ?X True))
                  (Not (Is-Tapered-Top-N-S ?X True))
                  (Not (Has-Hole ?X True))))))
;;; Cylindrical-Rod
(Define-Frame Cylindrical-Rod
               :Own-Slots
               ((Arity 1)
                (Documentation
                 "The class of all shapes \(\frac{1}{2}\) like\(\frac{1}{2}\) cylindrical rods.")
                (Instance-Of Class) (Subclass-Of 3d-Geometric-Primitive))
               :Axioms
               ((<=> (Cylindrical-Rod ?X)
                 (And (Sq-Parametric-Model ?X) (Is-Very-Tall ?X True)
                  (Has-Square-Longitude ?X True) (Has-Round-Latitude ?X
True)
                  (Not (Is-Tapered-Top-E-W ?X True))
                  (Not (Is-Tapered-Top-N-S ?X True))
                  (Not (Has-Hole ?X True))))))
;;; Cylindrical-Tube
(Define-Frame Cylindrical-Tube
               :Own-Slots
               ((Arity 1)
                (Documentation
                 "The class of all shapes \(\frac{1}{2}\)" like\(\frac{1}{2}\)" cylindrical tubes.")
                (Instance-Of Class) (Subclass-Of 3d-Geometric-Primitive))
              :Axioms
               ((<=> (Cylindrical-Tube ?X)
                 (And (Sq-Parametric-Model ?X)
                  (Or (Is-Very-Tall ?X True) (Is-Tall ?X True))
                  (Has-Square-Longitude ?X True) (Has-Round-Latitude ?X
True)
```

```
(Not (Is-Tapered-Top-E-W ?X True))
                  (Not (Is-Tapered-Top-N-S ?X True)) (Has-Hole ?X True)))))
;;; Disk
(Define-Frame Disk
              :Own-Slots
              ((Arity 1)
               (Documentation "The class of all shapes \(\frac{4}{3}\)" like\(\frac{4}{3}\)" disks.")
                (Instance-Of Class) (Subclass-Of 3d-Geometric-Primitive))
               :Axioms
               ((<=> (Disk ?X)
                 (And (Sq-Parametric-Model ?X) (Is-Short ?X True)
                  (Has-Square-Latitude ?X True) (Has-Round-Longitude ?X
True)
                  (Not (Is-Tapered-Top-E-W ?X True))
                  (Not (Is-Tapered-Top-N-S ?X True)) (Has-Hole ?X True)))))
;;; Hoop
(Define-Frame Hoop
               :Own-Slots
               ((Arity 1)
                (Documentation "The class of all shapes \(\frac{1}{2}\)" like\(\frac{1}{2}\)" hoops.")
                (Instance-Of Class) (Subclass-Of 3d-Geometric-Primitive))
               :Axioms
               ((<=> (Hoop ?X)
                 (And (Sq-Parametric-Model ?X) (Is-Short ?X True)
                  (Has-Square-Longitude ?X True) (Has-Round-Latitude ?X
True)
                  (Not (Is-Tapered-Top-E-W ?X True))
                  (Not (Is-Tapered-Top-N-S ?X True)) (Has-Hole ?X True)))))
;;; Ingot
(Define-Frame Ingot
               :Own-Slots
               ((Arity 1)
                (Documentation "The class of all shapes Y"likeY" ingots.")
                (Instance-Of Class) (Subclass-Of 3d-Geometric-Primitive))
               :Axioms
               ((<=> (Ingot ?X)
                 (And (Sq-Parametric-Model ?X) (Is-Long ?X True)
                  (Has-Square-Longitude ?X True) (Has-Square-Latitude ?X
True)
                  (Not (Is-Tapered-Top-E-W ?X True))
                  (Not (Is-Tapered-Top-N-S ?X True))
                  (Not (Has-Hole ?X True))))))
;;; Pyramid
(Define-Frame Pyramid
               :Own-Slots
               ((Arity 1)
                (Documentation
                 "The class of all shapes Y"likeY" rectangular base
pyramids.")
```

```
(Instance-Of Class) (Subclass-Of 3d-Geometric-Primitive))
               ((<=> (Pyramid ?X)
                 (And (Sq-Parametric-Model ?X) (Is-Tall ?X True)
                  (Has-Square-Longitude ?X True) (Has-Square-Latitude ?X
True)
                  (Has-Sharp-Top ?X True) (Not (Has-Hole ?X True))))))
;;; Rectangular-Rod
(Define-Frame Rectangular-Rod
              :Own-Slots
               ((Arity 1)
                (Documentation
                 "The class of all shapes \u2204"like\u2204" rectangular rods.")
                (Instance-Of Class) (Subclass-Of 3d-Geometric-Primitive))
               :Axioms
               ((<=> (Rectangular-Rod ?X)
                 (And (Sq-Parametric-Model ?X) (Is-Very-Long ?X True)
                  (Has-Square-Longitude ?X True) (Has-Square-Latitude ?X
True)
                  (Not (Is-Tapered-Top-E-W ?X True))
                  (Not (Is-Tapered-Top-N-S ?X True))
                  (Not (Has-Hole ?X True))))))
;;; Rectangular-Sheet
(Define-Frame Rectangular-Sheet
               :Own-Slots
               ((Arity 1)
                (Documentation
                 "The class of all shapes \u214" rectangular sheets.")
                (Instance-Of Class) (Subclass-Of 3d-Geometric-Primitive))
               :Axioms
               ((<=> (Rectangular-Sheet ?X)
                 (And (Sq-Parametric-Model ?X) (Is-Flat ?X True)
                  (Has-Square-Longitude ?X True) (Has-Square-Latitude ?X
True)
                  (Not (Is-Tapered-Top-E-W ?X True))
                  (Not (Is-Tapered-Top-N-S ?X True))
                  (Not (Has-Hole ?X True))))))
;;; Rectangular-Tube
(Define-Frame Rectangular-Tube
               :Own-Slots
               ((Arity 1)
                (Documentation
                 "The class of all shapes \(\frac{4}{3}\)" rectangular tubes.")
                (Instance-Of Class) (Subclass-Of 3d-Geometric-Primitive))
               :Axioms
               ((<=> (Rectangular-Tube ?X)
                 (And (Sq-Parametric-Model ?X)
                  (Or (Is-Very-Tall ?X True) (Is-Tall ?X True))
                  (Has-Square-Longitude ?X True) (Has-Square-Latitude ?X
True)
                  (Not (Is-Tapered-Top-E-W ?X True))
                  (Not (Is-Tapered-Top-N-S ?X True)) (Has-Hole ?X True)))))
```

```
;;; Sphere
(Define-Frame Sphere
             :Own-Slots
             ((Alias Sq-Parametric-Model) (Arity 1)
              (Documentation
               "This is the class of primitive 3-D shapes that are \u21a4"like
¥۳
spheres.")
              (Instance-Of Class)
              (Subclass-Of 3d-Geometric-Primitive Sq-Parametric-Model
Test))
             :Template-Slots
             ((Radio 1 (Slot-Value-Type Positive))
              (Radio 1 (Slot-Value-Type Positive)))
             :Axioms
             ((<=> (Sphere ?X)
               (And (Sq-Parametric-Model ?X)
               (Has-Similar-Scale-Parameters ?X True)
               (Has-Round-Latitude ?X True) (Has-Round-Longitude ?X True)
               (Not (Is-Tapered-Top-E-W ?X True))
               (Not (Is-Tapered-Top-N-S ?X True))
               (Not (Has-Hole ?X True))))))
;;; ------ Relations ------
;;; ------ Functions -----
;;; Radio
(Define-Function Radio
               (?Frame)
               :->
               ?Value
               "The Radio of a Sphere."
               (And (Sphere ?Frame) (Number ?Value)))
;;; ------ Instance -----
;;; ------ Axiom -----
;;; ----- Other -----
```

Appendix B

Modification of Protos program

The original code of the CL-Protos program (The common lisp version of Protos) was found at the software repository of the Artificial Intelligence laboratory, Department of Computer Sciences, University of Texas at Austin. All the copyrights are given to Daniel L. Dvorak, who had rewritten the original Protos system (implemented in Prolog) into Common Lisp, and to the authors of the Protos algorithm and following research, Ray Bareiss and Bruce W. Porter.

This program has been modified with the permission of the authors, on the behalf that it was used strictly for research purposes.

CL-Protos is a machine learning program which acquires knowledge for performing expert heuristic classification. It has been modified in it's heuristics to allow a more flexible learning proccess, sometimes in detriment of its computational cost. All the modifications have been stated in the program's text as comments and the original lines have been quoted, facilitating the direct comparision between the original version and the modified one.

```
;;; -*- Mode: Lisp; Syntax: Common-lisp; Base: 10; Package: PROTOS -*-
      Copyright (c) 1988, Daniel L. Dvorak.
;;;
;;; Last modified by Joaquin Delgado, Aug. 29 1995
(in-package 'protos)
(defvar *cur-exemplar*) ;;global of current exemplar being used.
(defvar *feat*) ;;global of current feature
(defvar *cat*)
                      ;;global of current category
(defvar *exp*)
                       ;;global of current exemplar
;;;
           DISCUSS MATCH WITH TEACHER
;;;
;;;
;;;
;;; Overview: This file contains the functions that Protos uses to
discuss
          a proposed exemplar-to-new case match. The top-level function
;;;
          where it all starts is "discuss-match".
;;;
;;;
;;; Functions:
                 add-new-exemplar
               get-approximate-importances
;;;
               discuss-differences
;;;
               discuss-high-importances
;;;
           discuss-match
;;;
           discuss-success (*)
;;;
           discuss-failure
;;;
           discuss-exemplars
;;;
          discuss-relevances
;;;
           discuss-removals
;;;
           discuss-unmatched
;;;
               discuss-unmatched-importances
;;;
```

```
enter-explanation
;;;
          read-category
;;;
;; (*) This part was modifed, specifically the functions:
;; 1) set-remindings2
;; 2) select-riminding-target
(defparameter *exemplar-menu* (make-menu
 :label "~%What would you like to do?"
 :items '((#¥T . ("Try the most prototypical remaining exemplar."
return next-exemplar))
        (#\forall S . ("Select a specific exemplar of this category."
show-exemplars))
        (#\forall C . ("Create new exemplar from this case."
                                                        return
add-exemplar))
         (#¥A . ("Abandon this case."
                                                   return
abandon)))))
;;; Function: (discuss-match match)
;;;
   Given: match, the details of an exemplar-to-newcase match
;;;
;;;
;;; Returns: 2 values: action and match, where:
              -- action is either:
;;;
                'done -- match contains an approved match structure;
;;;
                'newex -- match contains a newly created exemplar;
;;;
                'retry -- retry finding a match for this case;
;;;
                'redo -- redo the match to this exemplar;
;;;
                'next -- try the next hypothesis.
;;;
;;;
;;; Called by: compare
;;;
;;; Notes: Discuss-match presents the match to the teacher and asks
          if the classification is correct. Regardless of the answer,
          the teacher is presented with other questions which may
;;;
          modify the current match. It is in the subordinate functions
;;;
          of discuss-match where Protos learns from the teacher.
;;;------
(defun discuss-match (match)
 (print-match match)
 (examine-explanations match)
 (let ((prompt1 (format nil "~%Is ~A the correct classification for this
case? "
                (getname (exemplar-category (match-exemplar match))))))
   (if (prompt prompt1 nil 'y-or-n nil nil)
     (discuss-success match)
     (discuss-failure match))))
;;;------
   Function: (discuss-success match)
;;;
;;;
;;; Given: match, the results of an exemplar-to-new case match where the
;;;
                the teacher has approved the classification (but hasn't
                    yet approved the exemplar that the case was matched
;;;
to).
;;;
```

```
-- the same match if the teacher agrees that the chosen
;;; Returns:
              exemplar is appropriate;
;;;
            -- a different match if the teacher chooses a different
;;;
              exemplar; or
;;;
            -- nil if no more action is needed on this match (such as when
;;;
               the teacher decides to make a new exemplar from the case or
;;;
                  the teacher decides to abandon the case).
;;;
;;;
;;; Caller:
                discuss-match
;;;-----
(defun discuss-success (match)
  (let* ((newcase (match-newcase match))
       action)
    ;; Set the classification of the new case.
    (setf (case-category newcase) (exemplar-category (match-exemplar
match)))
    (multiple-value-setq (action match) (discuss-exemplars match))
    ;; Return if teacher decided to make exemplar of the new case.
    (if (eql 'newex action)
      (return-from discuss-success (values 'newex match)))
    ;; Return if the case is being abandoned by the user.
    (if (eql 'done action)
      (return-from discuss-success (values 'done match)))
    ;; Ask about unmatched features.
    (discuss-unmatched match)
    ;; Ask for unfocused instruction.
    (discuss-unfocused)
    ;; Update prototypicality of the exemplar.
    (if (mergeable match)
      (progn
        (if (prompt (format nil
                       "~%~%This case (~A) is similar enough to ~A that
Protos~
                                ~%is prepared to forget the case (and just
retain ~A).~
                              ~%~%Will it ever be important to distinguish
between these two? "
              (case-name newcase)
              (getname (match-exemplar match))
              (getname (match-exemplar match)))
                  nil 'y-or-n nil nil)
            (progn
            (update-prototypicality (match-exemplar match) 0.75)
            (return-from discuss-success (values 'newex (add-new-exemplar
newcase))))
            (progn
            (update-prototypicality (match-exemplar match) 1.0)
            (merge-exemplar match)
            (return-from discuss-success (values 'done match)))))
      ;; match was not mergeable
      (progn
        (format t "~%This case is different enough from ~A~
```

```
~%that it will be made into an exemplar."
             (getname (match-exemplar match)))
       (if (>= (match-similarity match) *strong-match*)
           (update-prototypicality (match-exemplar match) 0.50)
           (update-prototypicality (match-exemplar match) 0.25))
       (return-from discuss-success (values 'newex (add-new-exemplar
newcase)))))))
;;; Function: (update-prototypicality exemplar amount)
;;;
   Purpose: This function increments the given exemplar's typicality
;;;
value
                  and then (re-)sorts the affected category's list of
;;;
exemplars
              in decreasing order of typicality.
;;;-----
(defun update-prototypicality (exemplar amount)
 ;; Add amount to the exemplar's typicality value.
  (incf (exemplar-typicality exemplar) amount)
 ;; Re-sort the category's exemplars by typicality value.
  (let ((category (exemplar-category exemplar)))
    (setf (category-exemplars category)
       (sort (category-exemplars category) #'>= :key #'exemplar-
typicality))))
```

```
Function: (discuss-exemplars match)
;;;
;;;
;;; Given: match, a match to a Protos-selected exemplar of the correct
;;;
            category;
;;;
                  3 values, action and match, where:
    Returns:
;;;
                -- action may be either 'mrgex, 'done or 'newex, and
;;;
                -- match is either a teacher-approved exemplar of the same
;;;
                   category, or is a new exemplar (as when the teacher
;;;
                   decides to make a new exemplar of the case).
.;;;
;;;
    Caller:
                  discuss-success
;;;
(defun discuss-exemplars (match)
  (declare (special closed-exemplars))
  (let* ((exemplar (match-exemplar match))
        (newcase (match-newcase match))
       (viewed-exemplars (list exemplar))
       (category (exemplar-category exemplar))
       (exemplars (category-exemplars category))
       (exemplist (copy-list exemplars)))
    (loop
      (tagbody
      (if (prompt "~%Is this a suitable exemplar for matching the new case?
                nil 'y-or-n nil nil)
          (return-from discuss-exemplars (values 'mrgex match)))
      ;; The teacher has rejected this match, saying that this is not a
      ;; suitable exemplar. So, remember this fact so that the function
      ;; "test-hypotheses2" will skip over this exemplar if it appears in
      ;; the list of hypotheses. This could happen if we reached this
      ;; unsuitable exemplar through a difference link.
      (push (match-exemplar match) closed-exemplars)
      ;; If this incorrect match is strong enough (i.e., is a "near miss"),
      ;; then remember it for possibly installing a difference link later
      ;; when the case finally is correctly classified.
      (if (>= (match-nth-root-of-similarity match) *near-miss-threshold*)
           (push match *near-misses*))
      ;; Teacher has said no, this isn't a suitable exemplar for the new
case.
      ;; So, Protos now offers the teacher one of 4 choices:
           1. Take the most prototypical exemplar remaining and match to
it.
            2. Display the names of this category's exemplars and allow
      ;;
teacher
               to select one of them.
           3. Install this case as a new exemplar of its category.
      ;;
           4. Abandon this case.
      (ecase (menu-select *exemplar-menu*)
        (next-exemplar
          ;; Find the next most prototypical exemplar that hasn't already
been viewed.
          (do ()
```

```
((endp exemplist))
            (setq exemplar (pop exemplist))
            (if (not (member exemplar viewed-exemplars))
              (go SHOW-EXEMPLAR)))
          ;; No more exemplars left on exemplist.
          (if (prompt "~%You have rejected all exemplars in this category.~
                         ~%The only choice now is to either make a new
exemplar~
                         ~%of this case or abandon the case.~
                       ~%Shall I make a new exemplar of this case? "
                  nil 'y-or-n nil nil)
            (return-from discuss-exemplars (values 'newex (add-new-exemplar
newcase)))
            (progn
              (format t "~%Then this case is being abandoned.")
              (return-from discuss-exemplars (values 'done nil)))))
        (show-exemplars
          ;; Print the names of all the exemplars of this category.
          (terpri)
          (print-node-names exemplars t ", ")
          (loop
            (let ((input (prompt "~%Please enter one of the above names: "
                           nil 'termname category 'category)))
            (setq exemplar (find input exemplars :test #'equal :key #'node-
name))
            (if exemplar (go SHOW-EXEMPLAR)))))
        (add-exemplar
          ;; Make a new exemplar of the new case.
          (setf (case-category newcase) category)
          (return-from discuss-exemplars (values 'newex (add-new-exemplar
newcase))))
        (abandon
          (return-from discuss-exemplars (values 'done nil))))
     SHOW-EXEMPLAR
      ;; This is the bottom of the loop that begins by asking if the
exemplar
      ;; in the displayed match is a suitable match for newcase. We arrive
      ;; here only if the teacher has selected a different exemplar to
examine.
      (push exemplar viewed-exemplars)
      (setq match (compare-new-case exemplar newcase))
      (print-match match)
      (examine-explanations match)))))
```

```
Function: (add-new-exemplar newcase)
;;;
;;;
    Given: newcase, a case from which an exemplar is to be built and
;;;
                   installed;
;;;
;;;
;;; Returns:
                  This function is executed for its side-effect of creating
and
            installing a new exemplar in the category network.
;;;
;;;
    Callers: discuss-success, discuss-failure, discuss-exemplars.
;;;
;;;
               -- If newcase's category is unknown, prompt for it.
;;; Design:
            -- Ask if any features of newcase should NOT become part of
;;;
              the exemplar, and then remove them.
;;;
            -- Create the exemplar from newcase and install it as a member
;;;
               of the given category in the category network.
;;;
            -- For each feature that is newly occurring within the
;;;
category,
               ask about its relevance to the category. For each explana-
;;;
              tion given by the teacher, glean remindings from F-->C
;;;
               explanations and estimate importances from C-->F explana-
;;;
               tions.
;;;
            -- Initialize prototypicality of new exemplar to 1.0.
;;;
            -- Install pending difference links.
;;;
(defun add-new-exemplar (newcase)
  (let ((category (case-category newcase))
     exemplar)
    ;; If newcase's category is unknown, then prompt for it.
    (if (null category)
      (progn
        (setq category (read-category))
        (setf (case-category newcase) category)))
    ;; Ask if any features of newcase should NOT become features of the
    ;; exemplar. If so, remove them from the newcase.
    (discuss-removals newcase)
    ;; Create the exemplar from newcase and install it as a member
    ;; of the given category in the category network.
    (setq exemplar (make-term :name
                                    (case-name
                        :comment (case-comment newcase)
                        :features (case-features newcase)
                        :category (case-category newcase)
                        :typicality 1.0))
    (push exemplar *history*)
    (setq *cur-exemplar* exemplar)
   ;; Create the symbol that has the print-name of this exemplar.
    ;; (note that this is a 'set', not a 'setf').
    (set (case-name newcase) exemplar)
   ;; Update number of exemplar-containing categories.
    (if (null (category-exemplars category))
      (incf *number-of-ec-categories*))
```

```
;; Add this new exemplar to the category's list of exemplars (which are
    ;; sorted by typicality). Since this is a brand new exemplar, it will
    ;; have the lowest possible typicality and can therefore simply be
    ;; added to the end of the list. Also, install the "has-exemplar" and
    ;; "is-exemplar-of" relations between the category and exemplar.
    (setf (category-exemplars category)
        (nconc (category-exemplars category) (list exemplar)))
    (install-relation (list category) (list exemplar) nil *verb-hasExemplar*
nil)
    ;; For each feature of this exemplar, save a pointer to this exemplar
    ;; in the feature's structure. This is used in combine-remindings
    ;; (specifically, strengthen-features) so that if featural exemplars
    ;; are present in a match, they will be matched first.
    (dolist (feature (exemplar-features exemplar))
      (push exemplar (feature-of-exemplars feature)))
    ;; Discuss any fault variables that should be added to the category.
    (discuss-faultvars exemplar)
    ;; Discuss relevance of features new to this exemplar's category.
    (discuss-relevances exemplar)
    ;; Discuss category's unmatchable high-importance features.
    (discuss-high-importances category exemplar)
    ;; Install pending difference links.
    (discuss-near-misses exemplar)
    ;; End of function.
    (if *trace-new-exemplar*
      (progn
        (format t "~%The following new exemplar has been created:~%")
        (print-exemplar exemplar t 1)))
    exemplar))
```

```
;;;-----
              (read-category)
    Function:
;;;
;;;
              A category node.
   Returns:
;;;
;;;
   Design:
               This function prompts the user for a category name. If
;;;
the
          input is recognized as an existing category, then a pointer
;;;
          to that category node is returned.
;;;
;;;
             add-new-exemplar
    Callers:
(defun read-category ()
 (loop
   (let* ((input (prompt "~&What is this case's category? " nil
'termname
                  nil nil))
        (object (check-term-name input 'ask)))
     ;; If the name entered by the user exists or has been created ...
     (if object
       ;; then make sure it is a category (as opposed to, say, an
exemplar)
       (if (my-exemplar-p object)
          (progn
          (format *query-io*
               "~%Error: ~A is an exemplar, not a category.~
                   ~%Please enter a different category name: "
               input))
          (return-from read-category object))
       ;; user apparently said to forget this term.
       (format *query-io* "~%Sorry, but you HAVE to enter a category name:
")))))
```

```
Function:
                (discuss-removals newcase)
;;;
;;;
;;; Given: newcase, a case to be made into an exemplar
;;;
                The teacher is asked if any of the features of the new
    Purpose:
;;;
case
           are irrelevant to its future role as an exemplar of the
;;;
           category. If so, the teacher is allowed to remove those
;;;
           features.
;;;
;;;
;;; Called by: add-new-exemplar
;;;-----
(defun discuss-removals (newcase)
  (let ((features (case-features newcase))
      (category (case-category newcase))
      input)
    (format *query-io* "~%Case ~A is composed of the following features:~%"
                 (case-name newcase))
    (print-node-names features *query-io* ", ")
    (if (not (prompt (format nil "~%Are any of these features IRRELEVANT~
                             ~%to its role as an exemplar of ~A ? "
                      (getname category))
                nil 'y-or-n nil nil))
      (return-from discuss-removals (values)))
    (setq input (prompt "~%Then please enter, one per line:" "~&---> "
                 'termname newcase 'case))
    ;; If no features to be deleted, then just return.
    (if (null input)
      (return-from discuss-removals (values)))
    ;; Verify that each feature to be deleted was spelled correctly.
    (dolist (fname input)
      (let ((feature (check-term-name fname 'ask)))
      (if feature
          (if (member feature features)
            (setq features (delete feature features))
            (format *query-io* "~%Skipping ~A -- it wasn't a feature of the
case anyway."
                   fname)))))
    ;; Done deleting features -- store results back in newcase.
    (setf (case-features newcase) features)
    (format *query-io* "~%Thank you. Case ~A now contains only these
features:~%"
         (case-name newcase))
    (print-node-names features *query-io* ", ")
    (terpri)))
```

```
;;; Function: (discuss-faultvars exemplar)
;;;
    Purpose: This functions adds new fault variables to the category,
;;;
with
             the teachers approval.
;;;
;;;
;;; Design: 1. Collect all the variables specified as features of this
                 exemplar.
;;;
              2. Remove the variables that are already known to be fault
;;;
                 variables of this exemplar's category.
.;;;
              3. For each remaining variable, ask the teacher if the
;;;
                 variable is a fault variable.
;;;
;;;-----
(defun discuss-faultvars (exemplar)
                      (exemplar-category exemplar))
  (let* ((category
      (known-faultvars (category-faultvars category))
      (maybe-faultvars nil)
      pred)
   ;; Check every feature of exemplar for possible fault variables.
    (dolist (feature (exemplar-features exemplar))
     (if (and (setq pred (term-predicate feature))
            (predicate-relations pred)
            (not (member pred known-faultvars)))
       (push pred maybe-faultvars)))
   ;; Ask user about each candidate fault variable.
    (dolist (var maybe-faultvars)
     (if (prompt (format nil "~%Is ~A a fault variable of ~A ? "
                 (getname var) (getname category))
            nil 'y-or-n nil nil)
       (push var (category-faultvars category)))))))
;;;------
;;; Function: (discuss-near-misses exemplar)
;;;
              -- an exemplar which the new case has either been merged
    Given:
;;;
with
;;;
                or has been made into, and
                 -- *near-misses*, a global list of strong matches to
;;;
exemplars
                that were rejected by the teacher.
;;;
;;;
               For each near miss, the teacher is shown the unmatched
;;;
    Does:
features
              of the new case and the near-miss-exemplar, and is asked to
;;;
              specify which features are important discriminators.
;;;
              If any of the discriminating features currently is of low
;;;
or
              spurious importance to the target exemplar, then ask the
;;;
teacher
              for a reassessment of the importance.
;;;------
(defun discuss-near-misses (chosen-exemplar)
  ;; Consider each near-miss in turn ...
  (dolist (match *near-misses*)
```

```
;; Guard against the unusual situation where a near-miss was recorded
to
    ;; what turned out to be the chosen exemplar. This can happen in the
rare
    ;; case where the teacher changes his/her mind about a match.
    (if (not (eq chosen-exemplar (match-exemplar match)))
      (let* ((exemplar (match-exemplar match))
             (c-unmatched (match-unmatched match))
             (e-unmatched nil))
        ;; Collect non-spurious features of exemplar not matched by current
case.
        (dolist (result (match-results match))
          (if (and (eql 'unmatched (result-type result))
                 (/= 0.0 (result-importance result)))
            (push (result-feature result) e-unmatched)))
        (format t "~%~%Protos previously mistook this case for the exemplar
~A."
              (getname exemplar))
        (discuss-differences e-unmatched chosen-exemplar exemplar t)
        (discuss-differences c-unmatched exemplar chosen-exemplar nil)))))
     Function: (discuss-differences features from-exemplar to-exemplar
;;;
                                        from-chosen)
1.11
;;;
               a list of features of the to-exemplar that were not matched
;;;
     Given:
by
                the from-exemplar, and a 'from-chosen' flag that is non-nil
;;;
if
                from-exemplar is the "chosen exemplar" for the new case.
;;;
;;;
    Does:
               installs a difference link in the from-exemplar pointing to
;;;
the
                to-exemplar, annotated with a subset of 'features' approved
;;;
by
                the teacher as important discriminating features. If the
;;;
                    teacher feels that none of 'features' are important
;;;
discrimina-
               tors, then no difference link is installed.
;;;-----
(defun discuss-differences (features from-exemplar to-exemplar from-chosen)
  (if (null features)
      (return-from discuss-differences nil))
  (if from-chosen
      ;; Ask teacher about discriminating features of mistaken exemplar.
      (format t "~%The features of ~A that were not matched by the current
case are:~%"
            (getname to-exemplar))
      ;; Ask teacher about discriminating features of the chosen exemplar.
      (format t "~%The features of this case that were not matched by ~A
are:~%"
            (getname from-exemplar)))
  (let ((diff-features nil))
    (dolist (feature features)
```

```
(format t " ~A" (getname feature)))
    (format t "~%~%Which of these features (if any) are important
discriminators?")
    (dolist (feature features)
      (if (y-or-n-p "-\&--> -A ?-26T" (getname feature))
        (push feature diff-features)))
    ;; If no features were specified, then just return.
    (if (null diff-features)
      (progn
        (format t "~%Since no features were designated as important
discriminators,~
                     ~%then no difference link will be created/changed from
~A to ~A"
              (getname from-exemplar) (getname to-exemplar))
        (return-from discuss-differences (values))))
    ;; Display the difference link to be installed.
    (let ((newdiff (make-difference :node to-exemplar
                            :features diff-features))
        (olddiffs (exemplar-differences from-exemplar)))
      (format t "~%Installing new difference link:~
                 ~%~12@A: " (getname from-exemplar))
      (print-difference newdiff t 1)
      (terpri t)
      ;; Before installing the new difference link, check to see if there
      ;; is already a difference link between these two exemplars.
      ;; If so, ask the user if it should be retained or deleted.
      (dolist (olddiff olddiffs)
      (if (eq to-exemplar (difference-node olddiff))
          (progn
            (format t "~%A previous difference link exists:~
                        ~%~12@A: " (getname from-exemplar))
            (print-difference olddiff t 1)
            (if (y-or-n-p "~&~%Do you want this to be deleted? ")
              (setf (exemplar-differences from-exemplar) (delete olddiff
olddiffs))))))
      (push newdiff (exemplar-differences from-exemplar))
      ;; All of the discriminating features should probably have at least
      ;; moderate importance to the exemplar or category possessing those
      ;; features. If not, ask teacher to reassess the importance.
      (dolist (feature diff-features)
      (multiple-value-bind (imp node) (get-importance feature to-exemplar)
        (declare (ignore node))
        (if (or (null imp) (< (cdr imp) *reassess-importance-threshold*))</pre>
            (format t "~%~%~A is a discriminating feature, but it is
currently~
                            ~%of ~A importance. Please reassess its
importance."
                  (getname feature) (qualitative-value (cdr imp)
'importance))
            (reassess-importance feature to-exemplar))))))))
```

```
_____
                (qualitative-value strength type)
;;; Function:
;;;
               a word giving a qualitative interpretation of the strength
;;; Returns:
of
          an importance or reminding.
;;;
;;; Note: There is a "clinical scale" of normal, mild, moderate,
          severe, profound.
;;;-----
(defun qualitative-value (strength type)
  (if (null strength) (return-from qualitative-value 'unknown))
  (ecase type
    (importance (cond ((null strength)
                                                           'spurious)
                  ((>= strength *importance-necessary*) 'necessary)
                                                      'high)
                  ((>= strength *importance-high*)
                  ((>= strength *importance-moderate*)
                                                       'moderate)
                  ((>= strength *importance-low*)
                                                       'low)
                                                  'spurious)))
                  (t
                                                          'absolute)
                (cond ((= strength *reminding-absolute*)
    (reminding
                                                       'strong)
                  ((>= strength *reminding-strong*)
                  ((>= strength *reminding-moderate*)
                                                        'moderate)
                  ((> strength (- *reminding-moderate*)) 'weak)
                  ((> strength (- *reminding-strong*)) 'moderate)
                  ((> strength (- *reminding-absolute*)) 'strong)
                                                        'absolute)))))
                  (t
;; Function to compute the average of a set of numbers.
(defun average (&rest values)
  (/ (apply #'+ values) (length values)))
(defparameter *importance-alist*
           `((necessary . ,(average *importance-absolute* *importance-
necessary*))
                    . , (average *importance-necessary* *importance-high*))
           (moderate . ,(average *importance-high*
                                                           *importance-
moderate*))
           (low
                    . ,(average *importance-moderate* *importance-low*))
           (spurious . ,0.0)))
(defparameter *decide-importance-menu* (make-menu.
     :label "~%Do you agree?"
     :items '((#\forall Y . ("Yes."
                                                                 return
yes))
           (#¥E . ("no, let me revise the Explanation"
                                                                return
revise-expl))
           (#¥I . ("no, let me just revise the Importance" return
revise-imp))))))
(defparameter *importance-menu* (make-menu
     :label "~%What do you believe its importance to be?"
     :twocol t
     :items '((#\forall N . ("Necessary"
                                                 return necessary))
           (#¥L . ("Low"
                                             return low))
           (#¥H . ("High"
                                             return high))
           (#¥S . ("Spurious"
                                             return spurious))
                                             return moderate))
           (#¥M . ("Moderate"
```

```
(#¥Q . ("Quit (leave it unchanged)" return nochange)))))
,,,-----
;;; Function: (reassess-importance feature node)
;;;
;;; Purpose: Given a feature and a node (an exemplar or category) for
which
               we want to reassess the feature's importance, this function
;;;
               shows the user the feature's current importance (if any) in
;;;
                    qualitative form and asks the user for a revised
;;;
qualitative
              value.
;;;
;;;-----
(defun reassess-importance (feature node1)
  (let (qual-imp1
     qual-imp2
     target)
    ;; Get importance of this feature, and node to which it is important.
    (multiple-value-bind (importance node2)
     (get-importance feature node1)
     ;; Set the target node which is to get the revised importance value.
     ;; If no importance already exists, then make the target be a
category
     ;; rather than an exemplar.
     (setq target (if importance
                 node2
                  (if (my-exemplar-p node1)
                    (exemplar-category node1)
                   node1)))
     ;; Convert importance value to a qualitative form (high, moderate,
etc.).
     (setq qual-imp1 (if importance
                   (qualitative-value (cdr importance) 'importance)
                   'unknown))
     (format t "~%~%~A currently is of ~A importance to ~A"
           (getname feature)
           qual-imp1
           (getname target))
     ;; Ask teacher for a revised qualitative value of importance.
     (setq qual-imp2 (menu-select *importance-menu*))
     ;; If it's not the same as the old value then modify the importance.
     (if (and (not (equal 'nochange qual-imp2))
            (not (equal qual-imp1 qual-imp2)))
       (let ((new-imp (cdr (assoc qual-imp2 *importance-alist*))))
         ;; If there was a previous importance cons ...
         (if importance
           ;; Then modify its strength
           (rplacd importance new-imp)
           ;; Else create a new importance.
```

(push (cons feature new-imp) (category-importances target)))

(sort (category-importances target) #'>= :key #'cdr))))))

;; Sort the category's importances. (setf (category-importances target)

Function:

;;;

(get-unknown-features exemplar)

```
Given: exemplar, a newly-created exemplar
;;;
                 a list of features of the new exemplar whose importance
;;;
     Returns:
is
           unknown to its category or immediate general categories.
;;;
;;;
;;; Design:
                 For each feature of the new exemplar, this function looks
to
           see if the importance of this feature is known:
;;;
            -- idiosyncratically to the exemplar,
;;;
            -- to the exemplar's category, or
;;;
            -- to the next-most-general category(s).
;;;
;;;
           If not found in any of these places, then the feature is
;;;
           included in the list of unknowns that is returned.
;;;
           If the feature is found in the next-most-general category,
;;;
          then its importance is copied into the exemplar's category.
;;;
;;;
                  !*!*!*! I need to ask Ray if this last step is wise.
;;;
i * i * i * i
;;;
;;; Called by:
;;;------
(defun get-unknown-features (exemplar)
  (let ((category '(exemplar-category exemplar))
      (unknowns (copy-list (exemplar-features exemplar))))
     ;; Delete from unknowns all features having idiosyncratic importance.
     (dolist (imp (exemplar-importances exemplar))
       (setq unknowns (delete (car imp) unknowns :count 1)))
    ;; Delete from unknowns all features having importance to the category.
    (dolist (imp (category-importances category))
      (setq unknowns (delete (car imp) unknowns :count 1)))
    ;; Return now if all featural importances are known.
    (if (null unknowns) (return-from get-unknown-features nil))
    ;; Delete from unknowns all features having importance to the
      next-most-general category(s).
    (dolist (rel (node-relations category))
      (if (eq *verb-hasTypicalGen* (relation-verb rel))
        (dolist (cat (relation-to-nodes rel))
          (dolist (imp (category-importances cat))
            (if (member (car imp) unknowns)
              (push imp (category-importances category)))
            (setq unknowns (delete (car imp) unknowns :count 1))
            (if (null unknowns) (return-from get-unknown-features nil))))))
   unknowns))
;;; Function: (discuss-high-importances category exemplar)
;;;
    Given: -- category, the category of the new exemplar, and
;;;
               -- exemplar, the newly-created exemplar
;;;
;;;
                 If this category already has another exemplar, i.e., a
;;; Purpose:
```

;;;

prototype, then check every high-importance feature of the

```
prototype to see if it can be matched to a feature of the
;;;
               new exemplar. If not, ask the teacher if he/she wants to
;;;
               lower the importance of that feature.
;;;
;;;
;;; Notes: This procedure was part of the original Prolog Protos but
               was not mentioned in Ray Bareiss's dissertation since it
;;;
               was considered a detail.
;;;
;;;
;;; Caller:
                add-new-exemplar
;;;-----
(defun discuss-high-importances (category exemplar)
  (let ((prototype (first (category-exemplars category)))
      (e-features (exemplar-features exemplar))
                nil))
      (imps
    ;; If not in learning mode, then just return.
    (if (null *learning-mode*)
     (return-from discuss-high-importances (values)))
   ;; If the new exemplar IS the prototype, then just return.
   (if (eq prototype exemplar)
      (return-from discuss-high-importances (values)))
   ;; For each feature of known importance to the category ...
   (dolist (imp (category-importances category))
      (let* ((feature (car imp))
          (strength (cdr imp)))
     ;; If the feature is of high importance and is NOT a feature of
     ;; this new exemplar ...
     (if (and (>= strength *importance-high*)
            (member feature (exemplar-features prototype))
            (not (member feature e-features)))
         (push imp imps))))
   (if (null imps)
     (return-from discuss-high-importances (values)))
   (setq imps (nreverse imps))
   (format t "~2%The following are features of the prototype of ~A (~A)~
               ~%that are currently of high importance to the category.~
               ~%Protos is going to see if each of these features matches~
               ~%a feature of the new exemplar."
         (getname category) (getname prototype))
   (let ((column 0))
     (dolist (imp imps)
     (if (= column 0) (terpri))
     (setq column (mod (1+ column) 3))
     (format t " ~25A" (getname (car imp))))
     (terpri))
   (dolist (imp imps)
     (let ((feature (car imp))
         (strength (cdr imp)))
     (format t "~% ~A ... " (getname feature))
     ;; Then see if feature is related to an exemplar feature.
     (let ((result (kbpm 'FtoF feature strength prototype e-features)))
       (princ (result-type result))
```

```
;; If not, then ask teacher to reassess (lower) the importance
        ;; of this feature to the category.
        (if (eql 'unmatched (result-type result))
            (let ((qual-imp1 (qualitative-value strength 'importance))
               qual-imp2)
            (format t "~2%~A is a feature of ~A importance to category ~A~
                          ~%that does not match any feature of this new
exemplar.~
                          ~%The importance of ~A may be set too high."
                 (getname feature)
                 qual-imp1
                 (getname category)
                 (getname feature))
            ;; Ask teacher for a revised qualitative value of importance.
            (setq qual-imp2 (menu-select *importance-menu*))
            ;; If it's not the same as the old value then modify the
importance.
            (if (and (not (equal 'nochange qual-imp2))
                  (not (equal qual-imp1 qual-imp2)))
               (let ((new-strength (cdr (assoc qual-imp2 *importance-
alist*))))
                 ;; Then modify its strength ...
                 (rplacd imp new-strength)
                 ;; and re-sort the category's importances.
                 (setf (category-importances category)
                   (sort (category-importances category) #'>= :key
#'cdr)))))))))
;;; Function:
                (discuss-relevances exemplar)
;;;
;;;
    Given: exemplar, a newly-created exemplar
;;;
;;; Purpose:
                 Given a newly-created exemplar, this function attempts to
           determine the relevance of each feature whose importance to
;;;
           the category (or to the exemplar itself) is unknown.
;;;
;;;
;;; Notes: This function contains the top-level control for asking about
           the relevance of features to a category. Details are handled
;;;
;;;
           in the subordinate functions search-explanation,
           ask-for-explanation, and discuss-explanation.
;;;
;;;
;;;
           This function gives the teacher the option of submitting an
           explanation before Protos attempts to find one itself. This
;;;
can
           save a lot of time in those situations where the teacher KNOWS
;;;
           that Protos will not be able to find a feature-to-category
;;;
;;;
           explanation (unsuccessful searches are time-consuming).
;;;
;;; Caller:
               add-new-exemplar
;;;------
(defparameter *choose-explanation* (make-menu
     :label nil
     :items '((#\forall E . ("Enter an explanation."
                                                                 return
enter))
           (\# \L . ("let protos Look for an explanation." return look))
```

return

(#¥S . ("declare the feature Spurious."

```
spurious))
            (#¥U . ("leave this feature Unexplained."
unexplain)))))
(defun discuss-relevances (exemplar)
  (let ((category (exemplar-category exemplar))
      (unknowns (get-unknown-features exemplar))
      (ask-first nil))
    ;; If all features accounted for, then there is nothing to do.
    (if (null unknowns) (return-from discuss-relevances nil))
    (format t "~%~%Protos is currently unaware of the relevance~
             ~%of ~D feature~:P to the category ~A."
          (length unknowns) (getname category))
    ;; If several unknowns, see if teacher wants to be asked about each
one.
   ;; If only 1 or 2 unknowns, then just go ahead and ask about each one.
    (if (< (length unknowns) 3)
      (setq ask-first t)
   (if (prompt "~%~%Should Protos ask you about each feature~
                  ~%before it tries to find an explanation itself? "
                   nil 'y-or-n nil nil)
          (setq ask-first t)))
    ;; Main loop -- determine the relevance of each unknown feature.
    (dolist (feature unknowns)
      ;; If teacher is to be prompted about each feature ...
      (if ask-first
       ;; then prompt the teacher ...
        (progn
          (format t "~2%What is the relevance of ~A to ~A ?~
                       (getname feature) (getname category))
         ;; The teacher is given 3 choices:
                  1 -- Protos will search for an explanation.
         ;;
                  2 -- Protos will ask for an explanation from the
         ;;
teacher.
                  3 -- Teacher declares that the feature is spurious.
         ;;
         (case (menu-select *choose-explanation*)
            (look (search-explanation feature category t))
                        (ask-for-explanation feature category))
            (enter
            (spurious
                         (set-spurious
                                                feature category))
            (unexplain nil)
            (otherwise (format t "Error: discuss-relevances: menu returned
unexpected value."))))
       ;; else search the category network for an explanation.
        (search-explanation feature category t)))))
```

```
;;; Function: (search-explanation feature category first-time)
;;;
;;; Purpose: This function tries to find an explanation relating the
given
           feature to the given category.
;;;
;;;
              -- Do search for explanation.
;;; Design:
           -- If found, call discuss-explanation,
;;;
              else explain that no explanation was found and ask teacher
;;;
                   if he/she wants to give an explanation.
;;;
;;;
           -- If yes, call ask-for-explanation,
             else declare the feature to be spurious.
;;;
;;;------
(defun search-explanation (feature category first-time)
  (let ((result (kbpm 'FtoT feature *importance-big* category (exemplar-
features *cur-exemplar*))))
    (case (result-type result)
      (explained (discuss-explanation feature category (result-explanation
result)))
      (excluded nil); don't learn a reminding or importance here.
      (unmatched (format t "~%Protos ~:[still~;~] could not find an
explanation.~
                           ~%What is the relevance of ~A to ~A?
                   first-time (getname feature) (getname category))
             (case (menu-select *choose-explanation*)
               (look (search-explanation feature category nil))
                       (ask-for-explanation feature category))
               (enter
               (spurious
                                                    feature category))
                             (set-spurious
               (unexplain nil)
               (otherwise
                            (format t "Error: search-explanation: menu
returned unexpected value."))))
      (spurious (set-spurious feature category))
     (otherwise (format t "~%Error: search-explanation: result-type =
                       (result-type result))
             (set-spurious feature category)))))
(defun set-spurious (feature category)
  (push (cons feature 0.0) (category-importances category)))
(defparameter *new-term-menu* (make-menu
  :label "Is this a:"
  :items '((#\forall T . ("New term."
                                                                 return
new-term))
         (#\forall A . ("Abbreviation for an existing term." return abbrev))
         (#¥S . ("Synonym for an existing term."
                                                    return synonym))
         (#\forall Q . ("Quit (return to previous menu)." return quit)))))
```

```
(defun enter-new-terms ()
  (let (action termname termname2 node)
      (setq termname (prompt "~%~%Enter term name (terminate with blank
                       nil 'termname nil nil))
      (if (null termname) (return (values)))
      (setq action (menu-select *new-term-menu*))
      (case action
      (new-term
        (check-term-name termname 'ask))
      ((abbrev synonym)
          (setq termname2 (prompt "~% Enter name of existing term ---> "
nil
                            'termname nil nil))
          (if (null termname2) (return (values)))
          (if (not (symbolp termname2))
            (progn
              (format t "~% Error: ~A is not a symbol." termname2)
              (return (values))))
          (if (not (boundp termname2))
            (progn
              (format t "~% Error: ~A is unknown." termname2)
              (return (values))))
          (setq node (eval termname2))
          (if (not (node-p node))
            (progn
              (format t "~% Error: ~A is a ~A, not a node."
                    termname2 (type-of node))
              (return (values))))
          (if (eql action 'abbrev)
            (setf (node-abbrev node) termname)
            (push termname (node-synonyms node)))
          (set termname node))
        (return-from enter-new-terms (values)))))))
```

```
(ask-for-explanation feature category)
    Function:
;;;
;;;
                 This function prompts the teacher for an explanation
;;; Purpose:
relating
           the given feature to the given category (or, the teacher can
;;;
           give the missing fragment that will allow Protos to find an
;;;
           explanation from feature to category.
;;;
;;;
                 -- Get explanation from teacher.
;;; Design:
           -- Verify that the given explanation provides a path through
;;;
             the category network from the feature to the category.
;;;
           -- If so, call discuss-explanation,
;;;
             else harass the teacher for a correct explanation.
;;;
///
(defun ask-for-explanation (feature category)
  (let (explanation)
    (format t
         "~%~%Please explain how ~A is related to ~A (preferred)~
            ~%or how ~A is related to ~A (alternate form).~%"
         (getname feature) (getname category)
          (getname category) (getname feature))
    (setq explanation (enter-explanation))
    (if (null explanation) (return-from ask-for-explanation nil))
   (setq *feat* feature)
   (setq *cat* category)
   (setq *exp* explanation)
   ;; Try to verify the explanation by the simple syntactic strategy
   ;; of noticing if the explanation begins with 'feature' and ends
   ;; with 'category' (or vice versa). If so, then we don't have to
   ;; do the more time-consuming search through the category network.
                      (get-leaves explanation t nil))
   (let ((to-nodes
       (start-term (explanation-start-term explanation)))
     (cond ;; Is this a feature-to-category explanation?
          ((and (eq feature start-term) (member category to-nodes))
           (discuss-explanation feature category explanation))
          ;; Is this a category-to-feature explanation?
          ((and (eq category start-term) (member feature to-nodes))
           (discuss-explanation feature category explanation))
          ;; Apparently this is a fragment, so must search the C.N.
          (t (search-explanation feature category t))))))
```

```
(discuss-explanation feature target explanation)
     Function:
;;;
;;;
     Given: an explanation which may be either feature-to-target or
;;;
            target-to-feature (where "target" is a category or exemplar).
;;;
;;;
            Set both a reminding and an importance from the explanation.
    Do:
;;;
            The reminding comes from the feature-to-target explanation
;;;
            and the importance from the target-to-feature explanation.
;;;
            Simply invert the given explanation to get the other type.
;;;
;;;
                If the target is related to a more general category, then
;;; Note:
                  set-reminding will ask the user if the reminding should
;;;
really
                go to the more general category. If the user agrees, then
;;;
                set-reminding returns the new (reminded) category so that
;;;
                  set-importance will install the importance in that new
;;;
category.
;;;
;;; Callers: ask-for-explanation, search-explanation
(defun discuss-explanation (feature target explanation)
  (let ((from-leaves (get-leaves explanation nil nil))
      inverse-explanation)
    ;; If this is a feature-to-[category or exemplar] explanation ...
    (if (member feature from-leaves)
      ;; then set reminding, invert explanation, and set importance
      (progn
        (multiple-value-setq (target explanation)
          (set-reminding feature target explanation))
        (if target
            (progn
            (setq inverse-explanation (invert-explanation explanation))
            (set-importance feature target inverse-explanation))))
      ;; else this must be a [category or exemplar]-to-feature explanation,
      ;; so invert the explanation, set reminding, then set importance.
      ;; The reason why the reminding is always set before the importance
      ;; is that 'set-reminding' may truncate the explanation, changing
      ;; the target.
      (progn
        (setq inverse-explanation (invert-explanation explanation))
        (multiple-value-setq (target explanation)
          (set-reminding feature target inverse-explanation))
        (if target
            (set-importance feature target explanation))))))
```

```
Function: (set-reminding feature target explanation)
;;;
;;; Given: -- feature, the feature causing this reminding;
          -- target, the category or exemplar that is the object of
              the reminding to be installed;
;;;
            -- explanation, a feature-to-target explanation.
;;;
;;;
;;; Purpose:
                Given a feature-to-category or feature-to-exemplar
explanation,
           this function will install a reminding, subject to several
           heuristics.
;;;
;;;
;;; Returns: Two values:
                  -- The target category or exemplar that the reminding
;;;
really
                  points to. It can be different than the supplied target
;;;
if
                   the target is a category and the teacher agrees to let
;;;
the
                  reminding be to a more general category.
;;;
               -- The explanation from feature to actual target. This may
;;;
be
                  a truncated version of the supplied explanation.
;;;
;;;
     Heuristics: -- If the explanation contains a mutual exclusion
;;;
relation,
                then no reminding is installed.
;;;
             -- If the target of the explanation is an exemplar, then
;;;
               install the reminding without applying further heuristics.
;;;
             -- If the explanation contains a "has-specialization",
;;;
                "has-part", or a weak link, then truncate the explanation
;;;
               at that point (thus changing the target of the reminding).
;;;
;;;-----
(defun set-reminding (feature target explanation)
  (let (quality)
    ;; If mutual exclusion found, don't install reminding.
    (if (check-mutex explanation)
      (return-from set-reminding (values nil nil)))
    ;; If target of explanation is an exemplar,
    ;; install the reminding and return.
    (if (my-exemplar-p target)
      (progn
        (setq quality (explanation-strength explanation))
        (set-reminding2 feature target quality)
        (return-from set-reminding (values target explanation))))
    ;; Apply heuristics for truncating the explanation.
    (setq explanation (truncate-explanation explanation))
    ;; If explanation truncated down to nothing, just return.
    (if (null explanation)
      (return-from set-reminding (values nil nil)))
    ;; Install reminding to target(s) of the possibly-truncated explanation.
    (setq quality (explanation-strength explanation))
    ;; For each target of this explanation ...
    (dolist (e-target (get-leaves explanation t nil))
```

```
;;;-----
;;; Function: (set-reminding2 feature target quality)
;;; Modified by Joaquin Delgado, 28 Aug. 1995
;;;
              This function installs a reminding from 'feature' to
    Purpose:
;;;
'target'
                 with the given 'strength' if there is not already a
;;;
reminding
              between 'feature' and 'target'. If there is, then it is
;;;
updated
            only if this new reminding is stronger.
;;;
;;;-----
(defun set-reminding2 (feature target quality)
  (let ((rem (assoc target (feature-remindings feature))))
   ;; if there is an existing reminding to this target ...
   (if rem
     ;; then update the reminding strength only if this one is stronger
     (if (> quality (cdr rem))
        (progn
          (rplacd rem quality)
          (if *trace-new-remindings*
            (print-reminding feature target quality t))))
     ;; else create a reminding to it or a more general target.
     (progn
       (if (not (my-exemplar-p target))
          (setq target (select-reminding-target feature target quality)))
(push (cons target quality) (feature-remindings feature))
;;
       (if *trace-new-remindings*
;;
         (print-reminding feature target quality nil))
;;
;;-----
;; Modified by Joaquin Delgado on Aug 28, 1995
;; IF target is a list
         (if (listp target)
          (dolist (e-target target)
          (push (cons e-target quality) (feature-remindings feature))
          (if *trace-new-remindings*
              (print-reminding feature e-target quality nil))
              (setq quality (/ quality 4)))
                The strenght of the reminder will be 0.25% less for
more
            ;; general categories.
;; ELSE
            (progn
              (push (cons target quality) (feature-remindings feature))
          (if *trace-new-remindings*
            (print-reminding feature target quality nil))))
       (trim-remindings feature)))))
;;; Function: (select-reminding-target feature target quality)
;;; Modified by Joaquin Delgado on Aug 28, 1995
```

(set-reminding2 feature e-target quality))

(values target explanation)))

```
;;;
             -- a feature that evokes a reminding,
;;; Given:
             -- a potential target for that reminding, and
;;;
             -- the quality (strength) of the reminding.
;;;
;;;
;;; Returns: the actual target for the reminding, which may be either
the
                   given target or a more general category in the
;;;
generalization,
;;;
             functional, or partonomic hierarchies. If the given target
has
              one or more more-general categories, then the teacher is
;;;
asked
;;;
             to select the desired target.
(defun select-reminding-target (feature target quality)
  (let ((relatives (collect-relatives target
                         (list *verb-hasTypicalGen*
                            *verb-hasFunction*
                            *verb-partOf*)
                        nil)))
   ;; If this target has no categories that are more general, then just
   ;; return the original target.
    (if (null relatives)
     (return-from select-reminding-target target))
   (format *query-io* "~%Protos is ready to install a ~4,2F reminding from
~A to ~A."
        quality (getname feature) (getname target))
   ;; IF only one more general category ...
   (if (null (cdr relatives))
     ;; THEN ask about it specifically
;; (if (y-or-n-p "~%~%Should it instead install it to the more general
category ~A ? "
               (getname (car relatives)))
;;
       (setq target (car relatives)))
;; Modified by Joaquin Delgado on Aug, 28 1995
     (if (y-or-n-p "~%~%Should it also install it to the more general
category ~A ? "
              (getname (car relatives)))
        (setq target (list target (car relatives))))
         ;; target is a list of all the posible targets that the user
considers important
;; ELSE ask for a selection from the list of more general categories.
     (progn
;;
     (format *query-io* "~%~%Should it instead install it to one of the
more general categories:~%")
;; Modified by Joaquin Delgado on Aug 29 1995
        (format *query-io* "~%~%Should it also install it to the more
general categories:~%")
;;-----
```

```
(print-node-names relatives *query-io* " or ")
        (format *query-io* " ")
        (if (y-or-n-p)
;; added by Joaquin Delgado
            (progn
            (loop
;;Original -----
                (format *query-io* "~%Then please specify which one: ")
;;
                (setq target (check-term-name (read *query-io* nil nil)
;;
'fail))
                (if (member target relatives) (return (values)))
;;
                (format *query-io* "~%Error: you must enter one of the
;;
above terms.")))))
;; Modified by Joaquin Delgado on Aug 29 1995
                  (setq temp (prompt "~%Please specify which ones, in
order of importance (from less to most)~
                            ~%one category per line (terminate with
blank line): ~%"
                             "~&---> " 'symbol nil nil))
                    (dolist (e-target temp)
                       (setq e-target (check-term-name e-target 'fail))
                       (if (not (member e-target relatives))
                           (print-node-names relatives *query-io* " or
")
                           (format *query-io* "~%Error: you must enter
categories among of the above terms.")
                           (read-char)
                           (setq temp nil)
                           (return))
                         (progn
                           (if (not (listp target))
                             (setq temp2 (list target)))
                           (push e-target temp2))))
                    (if (not (null temp))
                           (return)))
               (setq target (reverse temp2)))))))
target))
;;; Function: (check-mutex explanation)
;;;
;;; Purpose: Given an explanation, this function returns T if a mutual-
                    exclusion relation is found anywhere within the
;;;
explanation.
             Otherwise, it returns NIL.
(defun check-mutex (explanation)
  (if (eq *verb-MEx* (relation-verb (explanation-relation explanation)))
     (return-from check-mutex t))
  (dolist (term (explanation-from-terms explanation))
   (if (explanation-p term)
     (if (check-mutex term)
         (return-from check-mutex t))))
  (dolist (term (explanation-to-terms explanation))
   (if (explanation-p term)
     (if (check-mutex term)
```

(return-from check-mutex t))))
nil)

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```
Function: (set-importance feature target explanation)
;;;
;;;
;;; Given: -- feature, the feature whose importance value is to be set;
            -- target, the category or exemplar where the importance is
;;;
               to be stored;
;;;
            -- explanation, a category-to-feature or exemplar-to-feature
;;;
               explanation.
;;;
;;;
;;; Purpose:
                Given a category-to-feature or exemplar-to-feature
explanation,
           this function sets the importance of the feature in the
category
           or exemplar, respectively.
;;;
;;;
;;; Notes: -- The importance value (a number in the range 0 - 1.0) is
              taken from the strength of the explanation.
;;;
;;;
;;; Callers:
              discuss-explanation
(defun set-importance (feature target explanation)
  (if (null explanation) (return-from set-importance (values)))
  (let* ((quality
                    (explanation-strength explanation))
       (qual-imp1 (qualitative-value quality 'importance))
       (category (if (my-exemplar-p target)
                  (exemplar-category target)
                   target))
       qual-imp2)
    ;; Show explanation to teacher for possible modification.
    (format t "~%~%Protos believes that ~A is of ~A importance to ~A~
            ~%based on the explanation:~
          (getname feature) qual-imp1 (getname category))
    (print-explanation explanation)
    ;; See if teacher agrees with this value of importance.
    (case (menu-select *decide-importance-menu*)
      (yes
                  ;; Teacher agrees with importance, so nothing to do.
      nil)
      (revise-expl ;; Teacher wants to revise the explanation.
        (prog ()
         TOP
         (setq explanation
               (get-specific-explanation feature target 'TtoF
(exemplar-features *cur-exemplar*)))
          (if (null explanation)
             (progn
              (format t "~%~%Protos could not find an explanation from ~A
to ~A"
                 (getname feature) (getname category))
             (if (y-or-n-p "~%Do you wish to revise your explanation
again? ")
                  (go TOP)))
             (print-explanation explanation))
         (set-importance feature target explanation)
         (return-from set-importance (values))))
```

```
(revise-imp ;; Teacher wants to just revise the importance.
      (setq qual-imp2 (menu-select *importance-menu*))
      (if (and (not (equal 'nochange qual-imp2))
             (not (equal qual-imp1 qual-imp2)))
          (setq quality (cdr (assoc qual-imp2 *importance-alist*))))))
    ;; Install the feature's importance in the category.
    (push (cons feature quality) (category-importances category))))
;;;-----
;;; Function: (discuss-unmatched-importances match)
;;;
;;; Given:
             a match of an exemplar of a wrong category to a newcase;
;;;
;;; Purpose: This function examines the exemplar's unmatched features to
               determine which ones are believed to be of moderate or low
;;;
                   importance, since it is possible that the reason the
;;;
feature is
               unmatched is because the importance was set too low.
               Protos then asks the teacher to reassess the importance
;;;
               of each of these features. The teacher is told the current
;;;
                qualitative strength of the feature's importance and then
;;;
asked
               to revise the importance to be either "necessary", "high",
;;;
               "moderate", "low", or "spurious".
(defun discuss-unmatched-importances (match)
  (let ((results (match-results match))
      (first-time t))
    (dolist (result results)
      (if (and (eql 'unmatched (result-type result))
            (< (result-importance result) *importance-high*))</pre>
          (progn
           (if first-time
            (progn
            (setq first-time nil)
           (format t
   "~%~%The incorrectly matched exemplar contains unmatched features~
      ~%of moderate or low importance. A possible reason that this case~
      ~%was classified incorrectly is because one or more of those
      ~%is really more important than Protos currently believes.")))
          (reassess-importance (result-feature result) (match-exemplar
match)))))))
```

```
(get-approximate-importances exemplar)
    Function:
;;;
;;;
;;; Given: exemplar, a newly-created exemplar
;;;
;;; Returns:
                 an alist of (feature . importance) with one entry for
each
           feature of the exemplar, sorted in decreasing order of
;;;
           importance.
;;;
;;;
;;; Caller:
               discuss-relevances
;;;
;;; Purpose:
                The decision to create this function was based on the
belief
           that when Protos discusses the relevance of each feature to its
;;;
           category, it is best to discuss the most important features
;;;
           first. Without this function, Protos would present the
;;;
features
           in the order in which they occurred in the new case (which may
;;;
           bear no resemblance to importances).
;;;
;;;
;;; Design:
                For each feature, this function looks for its importance
value
           in the following places (in this order):
;;;
           -- in the exemplar's category;
;;;
           -- in neighboring categories (immediate neighbors only);
;;;
           -- otherwise, the value 0 is assigned.
;;;
;;;-----
(defun get-approximate-importances (exemplar)
                        (copy-list (exemplar-features exemplar)))
  (let* ((features1
      (features2 (copy-list features1))
      (category (exemplar-category exemplar))
      (c-importances
                     (category-importances category))
                       nil))
      (importances
    ;; ----- Extract importances from the category. -----
    (dolist (feature features1)
      (let ((pair (assoc feature c-importances)))
      (if pair
         (progn
           (push pair importances)
           (setq features2 (delete feature features2)))))))
    (if (null features2)
      (return-from get-approximate-importances
           (sort importances #'> :key #'cdr)))
    (setg features1 (copy-list features2))
   ;; ----- Extract importances from neighboring categories.
    (dolist (relation (node-relations category))
      (dolist (to-node (relation-to-nodes relation))
      (if (my-category-p to-node)
         ;; ----- Extract importances from this neighbor. -----
         (let ((c-importances (category-importances to-node)))
           (dolist (feature features1)
           (let ((pair (assoc feature c-importances)))
             (if pair
```

```
Function: (discuss-unmatched match)
;;;
;;; Given: match, an approved exemplar-to-newcase match;
;;;
;;; Does: For each non-spurious unmatched feature of the exemplar,
           the teacher is asked to explain how a feature of the new case
;;;
           is related to the unmatched exemplar feature. The teacher
;;;
           may either enter an explanation or enter "none", "n" or "no".
;;;
;;;
                discuss-success
;;;
    Caller:
;;;-----
(defun discuss-unmatched (match)
  (let ((introduction t) ; Print introduction only on first feature.
      (results (match-results match)))
    ;; Iterate through the match results looking for unmatched features.
    (do* ((results results (cdr results))
          (result (car results) (car results)))
         ((endp results))
                                                  ; pointer to feature
      (let* ((feature (result-feature result))
node
          (importance (result-importance result))
                                                  ; importance of this
feature
          (quality (result-quality result))
            (unmatched (match-unmatched match))) ; unmatched
features
      (if (eql 'unmatched (result-type result))
         (progn
           (if introduction
             (progn
               (setq introduction nil)
               (format t
      "~%~%Protos would like to improve this classification by discussing~
      ~%some of the exemplar features it could not account for.~%")))
           (if (prompt (format nil
                         "~%Protos could not account for the exemplar
feature ~A.~
                               ~%Is ~A related to any feature of the new
case? "
                         (getname feature) (getname feature))
                   nil 'y-or-n nil nil)
             (let (newresult)
               (format t "~%Please explain how ~A is related to some
feature of the new case."
                       (getname feature))
               (enter-explanation)
               (setq newresult (compare-feature feature
                                       importance
                                       (match-exemplar match)
                                       (match-newcase match)))
               (format t "~%~%The exemplar feature ~A now has the
following match: "
                     (getname feature))
               (print-result 0 newresult)
               ;; Replace the unmatched result with the explained result.
```

```
(rplaca results newresult)
                  ;; Depending on the type of result, adjust the list
                  ;; of unmatched case features.
                  (ecase (result-type newresult)
                     (identical
                     (setq unmatched (delete feature unmatched)))
                     (explained
                    (setq unmatched (nset-difference
                    unmatched (explanation-from-terms (result-explanation
newresult)))))
                    (excluded
                    (setq unmatched (nset-difference
                    unmatched (explanation-from-terms (result-explanation
newresult)))))
                      (unmatched nil)
                      (spurious nil))
                    (setf (match-unmatched match) unmatched)
                ;; Update the overall similarity by dividing by the old
                ;; similarity and multiplying by the new similarity.
                (setf (match-similarity match)
                    (* (/ (match-similarity match) quality) (result-quality
newresult)))
                )))))))))
(defun discuss-unfocused ()
    ;; Ask for unfocused instruction.
    (format t "~%~%If there is any other instruction that you wish to
provide,~
                 ~%you may now do so from the following menu:~%")
```

(menu-select-2 '*unfocused-instruction-menu*))

```
Function: (discuss-failure match)
;;;
;;; Given: match, the results of an exemplar-to-new case match where the
                  the teacher has rejected the match because it is to a
;;;
                      wrong category.
;;;
;;;
;;; Returns:
                 -- the same match with the action slot set to 'next if
the
                  teacher has said to try the next hypothesis;
;;;
;;;
           -- the same match with the action slot set to 'done if the
                    teacher decided either to create a new exemplar from
;;;
this
;;;
                  case or just abandon this case.
;;;
;;; Caller: discuss-match
;;;
;;; Design: -- Reassess remindings that led to this (incorrect)
category.
           -- Ask for any revisions to the new case.
;;;
           -- Ask for censors.
;;;
           -- Ask for reassessment of importances of low-importance
;;;
             unmatched features.
;;;
;;;
           -- If strong match then record for later difference links.
           -- Allow unfocused instruction.
;;;
          -- Ask teacher whether to install this case as a new exemplar
            or discard it and go on to the next hypothesis.
;;;
;;;-----
(defparameter *failure-menu1* (make-menu
  :label "~%~%What do you want to do with this case now?~
            :items '((#\forall C . ("Create an exemplar from this case" return create))
         (#¥R . ("Retry finding a match for this case" return retry))
         (\# YM). ("reMatch this case to same exemplar" return redo))
         (#¥T . ("Try next hypothesis"
                                                    return next))
         (#¥Q . ("Quit (abandon this case)"
                                                                 return
abandon)))))
(defun discuss-failure (match)
  (declare (special closed-categories))
  ;; The teacher has rejected this match because it is to the wrong
category.
  ;; So, remember that fact so that the function "classify2" will skip over
  ;; any other hypothesized exemplars of the same category.
  (push (exemplar-category (match-exemplar match)) closed-categories)
  (format t "~%~%Protos will now try to learn from this error.")
 ;; If this incorrect match is strong enough (i.e., is a "near miss"),
  ;; then remember it for possibly installing a difference link later
  ;; when the case finally is correctly classified.
  (if (>= (match-nth-root-of-similarity match) *near-miss-threshold*)
     (push match *near-misses*))
  (reassess-remindings match)
  (discuss-censors match)
  (discuss-unmatched-importances match)
```

```
(discuss-unfocused)
  (case (menu-select *failure-menu1*)
    (create (values 'newex (add-new-exemplar (match-newcase match))))
              (values 'retry match))
    (retry
              (values 'redo match))
    (redo
    (next
              (values 'next match))
    (abandon (values 'done nil))))
(defparameter *censor-strength-menu* (make-menu
      :label nil
      :items `((#\forall \text{W} . ("Weak"
                                     return ,-0.25))
           (#¥M . ("Mclerate"
                                return ,-0.50))
            (#¥S . ("Strong" return ,-0.75))
            (#\forall A . ("Absolute" return , *absolute-censor*)))))
(defun discuss-censors (match)
  (let* ((exemplar (match-exemplar match))
       (category (exemplar-category exemplar))
       (newcase (match-newcase match))
       (features (case-features newcase))
       input
       feature
       strength)
    (format *query-io* "~2%The features of the new case are:~%")
    (print-node-names features *query-io* ", ")
    (if (prompt (format nil "~2%Are any of these features mutually
exclusive~
                              ~%with the category ~A? "
                 (getname category))
           nil 'y-or-n nil nil)
      (progn
            (format *query-io*
                "~%Please enter their name(s), enclosed in parentheses (or
type nil).~
                    ~%---> ")
          (setq input (read *query-io* nil nil))
          (if (or (null input) (listp input))
            (return (values)))
          (format *query-io* "~%Input error!"))
        (dolist (fname input)
          (setq feature (check-term-name fname 'ask))
          (if feature
            (progn
              (format *query-io* "~%Please rate the strength of ~A's
negative evidence: "
                    (getname feature))
              (setq strength (menu-select *censor-strength-menu*))
              (push (cons category strength) (feature-remindings feature))
              (if *trace-remindings*
                  (print-reminding feature category strength nil)))))))))
(defun add-censor ()
  (let (name feature target strength)
```

```
(format *query-io*
          "~%A censor lets a feature \( \frac{4}{3} \) discount \( \frac{4}{3} \) a category or exemplar.~
             ~%Please enter a feature name -----> ")
    (setq name (read *query-io* nil nil))
    (if (null name)
      (return-from add-censor nil))
    (setg feature (check-term-name name 'ask))
    (if (null feature)
      (return-from add-censor nil))
    (format *query-io* "~%Please enter a category or exemplar name ---> ")
    (setq name (read *query-io* nil nil))
    (if (null name)
      (return-from add-censor nil))
    (setq target (check-term-name name 'ask))
    (if (null target)
      (return-from add-censor nil))
    (format *query-io* "~%Please rate the strength of ~A's negative
evidence:"
          (getname feature))
    (setq strength (menu-select *censor-strength-menu*))
    (push (cons target strength) (feature-remindings feature))
    (if *trace-remindings*
      (print-reminding feature target strength nil))))
(defun change-importance ()
  (let (name feature target)
    (format *query-io* "~%Enter name of feature -----> ")
    (setq name (read *query-io* nil nil))
    (if (null name)
      (return-from change-importance (values)))
    (setq feature (check-term-name name 'ask))
    (if (null feature)
      (return-from change-importance (values)))
    (format *query-io* "~%Enter category or exemplar ---> ")
    (setq name (read *query-io* nil nil))
    (if (null name)
      (return-from change-importance (values)))
    (setq target (check-term-name name 'ask))
    (if (null target)
      (return-from change-importance (values)))
    (reassess-importance feature target)))
(defun show-relations (),
  (format *query-io* "~%Please enter the name of any term ---> ")
  (let* ((name (read *query-io* nil nil))
       (relations nil)
      node)
    (if (and (symbolp name) (boundp name))
      (setq node (eval name))
      (setg node (check-term-name name 'fail)))
    (if (and node (node-p node))
      (progn
        (setg relations (node-relations node))
        (if relations
            (format t "~%Relations that begin with ~A:" name)
            (dolist (rel relations)
              (format t "~%
                               ")
              (print-relation rel t 1)))
```

Appendix C

House knwoledge base produced by Protos

This knowledge base was generated by the modified Protos program, as the result of learning about general geometric forms of different examples of houses in the more general HOUSE domain.

```
;;; -*- Mode: Lisp; Syntax: Common-lisp; Base: 10; -*-
;;; Modified by Joaquin Delgado 08/23/95
;;; Comments: - Remindings to higher categories and classes were
                first introduced by hand. PROTOS only sets remindings
;;;
            one at a time, and does not propagate remindings in higher
;;;
                herarchies
;;;
;;;
                   walls
(term :name
      :remindings ((house 0.67))
      :importances ((cylinder 0.48) (cube 0.48))
                   (walls1 walls2)
      :exemplars
      :relations
                   (((walls equivalent story_2) "joaquin"
                 "Story 2 are walls of the second floor")
                    ((walls equivalent story_1) "joaquin"
                 "Story_1 are the walls of the first floor")
                    ((walls is part of house) "Joaquin" "Walls are part of
a house ")
                    ((walls sometimes is inferred from cube) "Joaquin"
                 "A cube suggest a house's base because of it's form.")
                    ((walls sometimes is inferred from cylinder) "Joaquin"
                 "A cylinder suggest a base of a house because of it's
form.")))
                   roof
(term :name
      :remindings ((house 0.70))
      :importances ((triangle_base_pyramid 0.48) (rectangular_sheet 0.48)
                (semi-cylinder 0.48)(square_base_pyramid 0.48) (prism
0.48))
                   (proto_roof roof5 roof2 roof1
      :exemplars
                    roof3 roof4)
      :relations
                   (((roof is part of house) "Joaquin" "A roof is part of a
house")
                    ((roof sometimes is inferred from prism) "Joaquin"
                 "A prism always suggest a roof because of its form")
                    ((roof sometimes is inferred from cone) "Joaquin"
                 "Cone sometimes suggest roof because of it's form")
                    ((roof sometimes is inferred from square_base_pyramid)
"Joaquin"
                 "A square base pyramid suggest roof because of it's form")
                    ((roof sometimes is inferred from semi-cylinder)
"Joaquin"
                 "A semi cylinder suggest roof because of it's form")
                    ((roof sometimes is inferred from rectangular_sheet)
"Joaquin"
                 "A rectangular sheet suggest roof because it's form")
                    ((roof
                                sometimes is
                                                       inferred
triangle_base_pyramid) "Joaquin"
```

```
"A triagle base pyramid suggest roof because of it's
form")))
(term :name
                  house
     :importances ((story_2 0.70) (rectangular_sheet 0.34) (semi-cylinder
0.34)
                    (square_base_pyramid 0.34) (cylinder 0.34) (cone 0.34)
                    (cube 0.95) (prism 0.78) (roof 0.70)
                    (walls 0.70))
                   (proto_house humble_house dome_house indian_house
      :exemplars
                   small_house two_story_house)
                   (((house has part roof) "Joaquin" "A roof is part of a
      :relations
house")
                    ((house has function (shelter person)) "Joaquin"
                 "A house has the function of shelter for persons")
                   ((house has part walls) "Joaquin" "walls are part of a
house ")))
                  proto_house
(term :name
      :comment
                  "A general abstract house "
                 house
      :category
      :features
                  (walls roof)
      :typicality 6.50)
(predicate :name
                      shelter)
(term :name
                  person)
(term :name
                 (shelter person)
     :relations
                  ((((shelter person) sometimes is function of house)
"Joaquin"
                "A house has the function of shelter for persons")))
(term :name
                  prism
      :remindings ((walls -9999.00) (roof 0.78) (house 0.01))
      :relations (((prism always suggests roof) "Joaquin"
                "A prism always suggest a roof because of its form")))
                  proto_roof
(term :name
     :comment
                  "(This is a prototypical roof)"
                 roof
     :category
      :features
                  (prism)
      :typicality 2.25
      :differences ((proto_house <-- (cube))))
(term :name
                  cone
      :remindings ((walls -.75) (house 0.34))
      :relations (((cone sometimes suggests roof) "Joaquin"
                "Cone sometimes suggest roof because of it's form")))
(term :name
                  roof1
                  "(Yet another example of roof)"
      :comment
      :category
                 roof
      :features
                  (cone)
      :typicality 1.00)
                  square_base_pyramid
(term :name
      :remindings ((walls -.75) (roof 0.80) (house 0.56))
      :relations (((square_base_pyramid suggests roof) "Joaquin"
                "A square base pyramid suggest roof because of it's
form")))
```

```
(term :name
                   roof2
                   roof
      :category
                   (square_base_pyramid)
      :features
      :typicality 1.00)
(term : name
                   semi-cylinder
      :remindings ((roof 0.45) (house 0.34))
      :relations
                   (((semi-cylinder sometimes suggests roof) "Joaquin"
                 "A semi cylinder suggest roof because of it's form")))
                   roof3
(term :name
                   "(Yet another example of roof)"
      :comment
      :category
                   roof
                   (semi-cylinder)
      :features
      :typicality 1.00)
(term :name
                   rectangular_sheet
      :remindings ((walls -.75) (roof 0.48) (house 0.34))
                   (((rectangular_sheet sometimes suggests roof) "Joaquin"
                 "A rectangular sheet suggest roof because it's form")))
(term :name
                   roof5
                   "(Yet another example of roof)"
      :comment
      :category
                   roof
      :features
                   (rectangular_sheet)
      :typicality 1.00)
                   triangle_base_pyramid
(term :name
      :remindings ((roof 0.48) (house 0.01))
                     (((triangle_base_pyramid sometimes suggests roof)
      :relations
"Joaquin"
                 "A triagle base pyramid suggest roof because of it's
form")))
(term :name
                   roof4
      :comment
                   "(Yet another example of roof)"
                   roof
      :category
      :features
                   (triangle_base_pyramid)
      :typicality 1.00)
(term :name
                   cube
                   (box)
     :synonyms
      :remindings ((roof -9999.00) (walls 0.78) (house 0.01))
      :relations
                   (((cube always suggests walls) "Joaquin"
                 "A cube suggest a house's walls because of it's form.")
                    ((cube has typical generalization parallelopypid)
"Joaquin"
                 "A cube is a type of parallelopypid")))
                   walls1
(term :name
                   "(Yet another example of walls)"
      :comment
                  walls
      :category
      :features
                   (parallelopypid)
      :typicality 2.25
      :differences ((humble_house <-- (rectangular_sheet))
                (proto_house <-- (prism))))
(term :name
                   cylinder
      :remindings ((walls 0.45) (house 0.34))
                   (((cylinder sometimes suggests walls) "Joaquin"
      :relations
                 "A cylinder suggest walls of a house because of it's
form.")))
```

```
walls2
(term :name
                  "(Yet another example of walls)"
      :comment
                  walls
      :category
                   (cylinder)
      :features
      :typicality 1.00)
(term :name
                  parallelopypid
      :remindings ((roof -.75))
                    (((parallelopypid has typical specialization cube)
      :relations
"Joaquin"
                 "A cube is a type of parallelopypid")))
                   indian_house
(term :name
                    "(This is an example of an indian house, i.e. a cone
      :comment
over a cylinder)"
      :category
                  house
                   (cone cylinder)
      :features
      :typicality 1.00
      :differences ((walls1 <-- (cube))))
                   small_house
(term :name
                  "(This is a small house, e.i. a pyramid over a box)"
      :comment
      :category house
      :features (cube square_base_pyramid)
      :typicality 1.00)
(term :name
                   dome_house
                   "(This is a dome-like house, i.e. a semi-cylinder over a
      :comment
parallelopypid)"
      :category
                  house
      :features
                   (semi-cylinder parallelopypid)
      :typicality 1.00
      :differences ((proto_roof <-- (prism))))
(term :name
                  humble_house
                   "(This is an example of a humble_house)"
      :comment
      :category
                  (parallelopypid rectangular_sheet)
      :features
      :typicality 1.00)
                  two_story_house
(case :name
                   "(This is a two story house)"
      :comment
                  joaquin)
      :creator
                  story_1
(term :name
      :remindings ((house 0.70))
                   (((story_1 equivalent walls) "joaquin"
      :relations
                 "Story_1 are the walls of the first floor")))
(term :name
                  story_2
      :remindings ((house 0.70))
      :relations (((story_2 equivalent walls) "joaquin"
                 "Story 2 are walls of the seccond floor")))
(case :name
                  two story house
                  HOUSE
      :category
      :preclassify T
                 (story_1 story_2 prism)
      :features
      :disposition (BECAME TWO_STORY_HOUSE)
                   "(This is a two story house)"
      :comment
      :creator
                  joaquin)
```

(term :name

two_story_house
"(This is a two story house)" :comment

:category house

(story_1 story_2 prism) :features

:typicality 1.00)

Appendix D

Implementation Guidelines

D-1 Ontolingua - Nextpert Translation

Both Ontolingua and Nextpert Object are Object Oriented (O.O.) and Rule-Based, and use an intermediate (programmer readable) language for representing both objects and rules in lisp like format. Both also have a pretty good interface for defining and editing ontologies in a "led by hand" mode, essential for a good quality knowledge design. The main difference is the expressiveness and the purpose of the underlying languages:

- * In Ontolingua, KIF (Knowledge Interchange Format) is a very expressive language, that was not designed for KP but as an interchange format of knowledge. It is *self defined* by a KIF ontology and it is extensible in any extent due to the way it was designed. A good example is the Frame Ontology that is the basic data structure for KR in Ontolingua. Its application independent and as general as it can be for facilitating the translation between different sources of knowledge. It supports non-monotonicity, that is the capability of drawing conclusions based on the absence of knowledge from a database (incomplete information).
- * In Nexpert Object, Nexpert is an application oriented language that is used for KR and KP as well. This makes it more complicated to understand and limits it's extensibility. On the other hand, its 0.0. characteristics are more powerful as it supports methods for describing behavior and control of individual slots, objects or set of objects. This, in principle is not supported by KIF nor Ontolingua. It supports non-monotonicity as well.

Analogies were found not at the underlying language level but at the knowledge input level and the data structures used to represent knowledge. The constructions of ontologies in both systems have similar pattern, making it simpler, after understanding the analogies, to translate ontologies from one system into another. Some times, depending which is the source and the target system, some information might be incomplete.

Here is a list of all the mayor concepts needed to be understood in order to build any basic ontology in Ontolingua. Beside each question I will add, between parenthesis, what *possibly* are <u>relative or equivalent concepts</u> in the Nexpert Object system. For further analysis please refer to the bibliography.

In Ontolingua.-

What is an Ontology? (A Knowledge Base)

An ontology is an explicit specification of some topic. For our purposes, it is a formal and declarative representation which includes the vocabulary (or names) for referring to the terms in that subject area and the logical statements that describe what the terms are, how they are related to each other, and how they can or cannot be related to each other. Ontologies therefore provide a vocabulary for representing and communicating knowledgeabout some topic and a set of relationships that hold among the terms in that vocabulary.

What is a Frame? (An Object)

A frame is a named data structure (or object) which is used to represent some concept in a domain. A frame can be a class, instance, slot, facet, function, relation, or axiom. A frame

allows one to group some related statements about that concept. Associated with each frame is a group of slots, facets, and values on the slots or facets.

What is a Term? (An Object)

A term is any object that has a definition (e.g., slots, classes, instances, relations, functions). An axiom is not considered a term.

What is a Class? (A Class)

A class is a representation for a conceptual grouping of similar terms. For example, a computer could be represented as a class which would have many subclasses such as personal computers, mainframes, workstations, etc. Each class is described by a definition which specifies the slots and values that describe the class itself (not the members of the class), slots and values that describe the instances of that class, and logical statements (called axioms) that describe the class but can't be represented using slots and values.

What is an Instance? (An Object in its pure sense)

All of the terms in an ontology that have an associated definition (i.e.classes, slots, relations, functions, facets) are an instance of some class. Classes are instances of Class, functions are instances of Function, etc. An instance should not be confused with an Individual because an instance may be a class whereas an Individual cannot be a class.

What is a Facet? (A Meta-Slot)

Facets are used to represent information about a slot on an object. Usually facets represent some constraint on an instance slot. For example, Slot-Value-Type is a facet which can be used to represent that for instances of the class Person, the value of the slot Has-Mother must be an instance of Female-Person. The most commonly used facets are: Slot-Cardinality, Minimum-Slot-Cardinality, Maximum-Slot-Cardinality, and Slot-Value-Type.

What is an Instance Slot? (A Slot)

An instance slot is a slot on a class that is used to describe a property of the instances of a class rather than the class itself. For example, mass would be an instance slot because it is used to describe how much a particular instance weighs rather than what the class weighs (obviously a class doesn't have mass since it is an abstract concept). Whereas, subclass-of is an own slot because it is used to describe the class itself.

What is an Own Slot? (A Class Slot)

Own Slots are slots used to describe properties of the term itself. For most terms (i.e., any term except a class), the only slots they have are own slots. However, most classes also have instance slots that are used to describe properties of the instances of a class rather than the class itself. For example on the class Mother, subclass-of is an own slot because it is used to indicate a property of the class Mother. Whereas, has-children would be an instance slot because it describes a property of instances of the class Mother.

What is a Value? (A Special type of property - named "Value")

A value is a term which is related to the current definition through a slot or facet. For example, FemalePerson would be the value of the slot subclass-of for the class Mother. As another example, 1 would be the value of the facet Minimum-Slot-Cardinality for the slot Has-Children on the class Mother.

What is a Relation? (Is not defined explicitly in Nexpert Object)

A relation is used to describe a relationship among two or more terms. If a relation represents a relationship between only two terms, it is called a slot or a binary relation. If the relation describes a relationship among n terms such that there is a unique nth term corresponding to any set of the first n-1 terms, then the relation is called a function.

What is a Function? (Is not defined explicitly in Nexpert Object)

A function is a special type of relation which relates some number of terms to exactly one other term. That is, a function is a relation such that no two relationships of n terms in the relation have the same first n-1 terms. For example, mother is a function that relates an animal to exactly one female animal. A function may also be referred to as a slot if it relates only two terms.

What is Domain? (Is not defined explicitly in Nexpert Object) The domain of a slot is a class that restricts the terms on which the slot can be added. A slot can only be added to terms which are an instance-of its domain.

Note that the domain is typically a superset of the exact-domain of a relation. For example, one can say that the domain of Mother-Of is Female-Animal, but since not all female animals are mothers, Female-Animal could not be the exact-domain of Mother-Of.

What is Range? (Is not defined explicitly in Nexpert Object)

The range of a relation is a class that restricts the values which the relation can have. A value can only be added to the relation if it is an instance-of its range.

Note that the range is typically a superset of the exact-range of a relation. For example, one can say that the range of Has-Mother is Female-Animal, but since not all female animals are mothers, Female Animal could not be the exact-range of Has-Mother.

NOTE: Relations, functions, domains and ranges are implicitly defined when creating Classes and defining rules in Nexpert Object.

What is an Axiom? (A Rule)

An axiom is a sentence in first order logic that is assumed to be true without proof. In practice, we use axioms to refer to the sentences that cannot be represented using only slots and values on a frame.

Axioms must be entered in prefix notation. Use => to indicate logical implication, <=> to indicate logical equivalence, and to indicate conjunction, or to indicate disjunction, not to indicate negation, and exists to indicate existential quantification. Free variables are assumed to be universally quantified. Variable names must start with a question mark.

For example, you would represent the statement:

If any two animals are siblings, then there exists someone who is the mother of both of them.

With the axiom:

What is an Augmented Definition?

An augmented definition is rather like any other definition, only it is a specialization of a definition made in a different ontology. For example, if I have an ontology of vehicles, and another ontology of police vehicles that includes the ontology of vehicles, I might want to augment the definition of the class Vehicle so that all vehicles have radios and guns. This can be done by augmenting the definition of the class Vehicle in the police-vehicles ontology.

On The Nexpert Object side .-

We have several differences as follows:

METHODS: As said before methods describe the behavior of individual slots, objects, or sets of objects. Methods are composed primarily of a set of actions which when executed modify the behavior of the object upon which they act.

There is an effort for "Extending Otolingua for Representing Control Knowledge" by Eliana Cohelo and Guy Lapalme to be presented in IJCAI-95, but actually because KIF can be extended for an specific application, I don't see any problem in creating a "method ontology".

RULES: In Nexpert, rules have three basic parts:

- Left-hand side conditions
- The Hypothesis
- The right-hand side actions

Although this does not differs from any rule definition, in Nexpert the Hypothesis, is a boolean slot and it is treated as a special object as seen in the application interface.

Rules, in Nextpert, represent among other things: relations, heuristics, procedural knowledge, and temporal structure of knowledge. This might suggest that Ontolingua's *relations* and *functions* might be some kind of rules, but focused in an ontological way this is not true.

Partial Conclusions

Because the representation of Control Knowledge is not essential for the meanings of this project (building an 3-D Shape Ontology) and there is a way of interpreting Nextpert's KR Data Structures into Ontolingua's own data structures it is feasible to use Ontolingua for this project.

Bibliography

1) Ontolingua, on-line system "help", KSL-Interactive Network Services, URL:

http://ksl.stanford.edu

- 2) Neuron Data, Nexpert Object system manuals: "Knowledge Design".
- 3) Michael R. Genesereth, Richard E. Fikes, "Knowledge Interchange Format, Version 3.0, Reference Manual", Report Logic-92-1, C.S. Department, Stanford University

D-2 Knowledge Level and Symbol Level Interface

Here is a rough description of what the interface between the symbol level and the knowoledge level might require. First I would like to remind you some important points:

- A case (or exemplar) description is a collection of features that represent attributes that the TEACHER (user) thinks are potentially RELEVANT to its classification.
- Each feature represents an independent attribute of the case.
- If RELATIONSHIPS BETWEEN ATTRIBUTES are relevant to the case's classifications in our system), they must be included in its featural description. The CONSISTENCY of these relations have to be enforced by the teacher (or by the system).

Here is an example:

Case: ARCH /* Formed by three blocks */

Features: block(a), block(b), block(c), above(c,a), above(c,b)

touches(c,a), touches(c,b), doNotTouch(a,b)

These relations have to be consistent with the VR world!!

What Is needed for the integration:

- 1) That Nextpert Object or whatever, decides and initiates the classification (or learning) process, by giving me the list of all the FEATURES of the new inputed case. Therefor it has to be decided when a newly formed case is ready for classifying. If there is an analogous case in the case base then PROTOS will create an hypothesis of what the case is.
- 2) That an interactive conversation could be held between the computer and the teacher in the learning process mainly for imputing domain knowledge as an explanation (using a fixed vocabulary). Note that the user has to be able to refer to any component of a complex object in an unambiguous way.

To get a grasp of what is intended to say in point 2 here is an example of a very idealized conversation with PROTOS:

SYSTEM: Protos, a new case has the features roof, walls, window, door, antenna, above(roof,walls),touches(roof,walls)

PROTOS: Based on this description, I am most strongly reminded of the category HOUSES. I will retrieve a past example,

House-01, and will try to explain the similarity of these two cases by comparing their features. Many of the features of the new case match House-01 directly, but there are still some features I cannot match. First, House-01 does not have window.

TEACHER: That is true. However a window ENABLES a person inside a house to see to the outside, so it is a relevant feature to house in general.

PROTOS: I now believe that having a window is a moderated feature for HOUSES. In future cases if a window appears it will remind me of houses.

TEACHER: O.K.

PROTOS: Second, House-01 does not have antenna.

TEACHER: An antenna is not a important feature for a house (it's spurious).

PROTOS: Since this case doesn't differ from House-01 in many respects, I will not save it as a new exemplar of HOUSES. Is this a satisfactory disposition of this case?

TEACHER: Yes.