

# Understanding Ontologies in Scholarly Disciplines

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## Abstract

Description logics are valuable for modeling the conceptual structures of scientific and engineering research because the underlying ontologies generally have a taxonomic core. Such structures have natural representations through semantic networks that mirror the underlying description logic graph-theoretic structures and are more comprehensible than logical notations to those developing and studying the models. This article reports experience in the development of visual language tools for description logics with the objective of making research issues, past and present, more understandable.

## 1 Introduction

Scholarship may be conceptualized as the rational reconstruction of intuitive notions within the conventions of a discipline. When scholarly disciplines examine their foundations the outcome is generally a taxonomy based on logical definitions intended to capture the concepts of the primary researchers and to clarify the differences underlying disagreements. The development and analysis of such taxonomies can be helpful to active research communities attempting to clarify their activities, and it is also significant in retrospect to historians reconstructing the conceptual structures of those recognized as major contributors to the growth of human knowledge. Description logics managed through visual languages isomorphic to the underlying graph-theoretic structures, and visually transformable through well-defined deductive processes, offer an attractive technology to support both historic studies and active research communities.

The work reported in this paper is a continuation of that on the use of knowledge acquisition and representation tools to model the knowledge structures of scholarly communities [1]. These studies involved the use of the visual language [2] that allowed knowledge structures to be expressed as semantic networks with well-defined semantics that were automatically translated into data structures in KRS [3], an implementation of a CLASSIC-like [4] description logic. Inferences in KRS were graphed automatically as additions to the semantic network so that users could visualize both the inputs and outputs without translation into logical formulae [5].

In recent years there have been major advances in description logic research that make it realistic to use richer representations incorporating negation, disjunction and some aspects of recursion [6]. This enables one to overcome of the artificiality of the knowledge structures noted above that attempted to avoid such constructions, resulting in unnatural representations, of lesser use as models meaningful to the relevant community.

This paper reports on recent developments that: extend the visual language to support richer description logics with disjunction, negation and existential quantification; exemplifies the process of transforming semantic networks in coming to understand them; discusses factoring deduction into its intensional and extensional operations to support paraconsistent reasoning [7]; and raises a number of issues for future research.

## 2 Understanding an Ontology

I have used the term “understanding an ontology” in order to capture the notion that users should be able to see the effects of variations in the ontology, some of which do not change its meaning, others of which change it significantly in ways that can be readily understood, and others of which are logical consequences that may require some degree of explanation if they are to be understood.

A visual language representation of ontologies is useful to support those without great fluency in symbolic logic in its textual representation. Shin [8] has demonstrated that diagrammatic reasoning can provide a rigorous foundation for logical inference, and psychological experiments show that non-technical users of a knowledge-based system find inference in a visual language easier to understand [9].

### 2.1 Designing a visual language for description logics

The design criteria for the visual language have been:

- 1 The visual language should provide an alternative syntax to linear textual languages but have standard logical semantics and be intertranslatable with textual languages.
- 2 The visual language should be simple to explain to users, both those with deep understanding of symbolic logic and those with little understanding.
- 3 The visual language should correspond to the natural graph-theoretic representation of description logics that is commonly used in describing operations on them and in implementing computational inference [10].
- 4 As many as possible of the syntactic and inferential transformations of expressions in the visual language should be formally specifiable as graph-theoretic operations.
- 5 The visual language should be usable both for the input of logical definitions and assertions, and for the output of logical inferences.
- 6 The visual language should support modularity in the specification of ontologies such that definitions/assertions may be specified in one document and used in others [11].
- 7 Subject to these requirements, the visual language should be similar to existing languages for semantic networks.

### 2.2 Overview of the KNet visual language

KNet, the visual language used in this paper is implemented in a generic visual language shell, RepNet [12], that supports a user-specified syntax for node types and connecting lines and a user scriptable interface for translation to and from semantic networks in the visual language enabling integration with web services such as KRS and RACER [13]. It is simple to change the language to conform to existing practices, user preferences, or changing notions of what is required. The examples given follow the conventions described in [2] and are similar to those of other graphical interfaces for description logics such as RICE [14].

**Concepts** are represented by the concept name in an oval. Concepts are *defined* through the property they *encode* [15] in the graph derived by tracing outgoing arrows from the concept, terminating at concept nodes or terminal nodes. Concepts are *used* through incoming arrows, and may be both defined and used in the same graph.

**Base**, or primitive, concepts are indicated by short horizontal markers in the concept oval that indicate that there is some unspecified outgoing graph unique to the concept. This is a sufficient *explication* (in Carnap/Quine terms [16]) for the logical properties of a primitive concept. From a logical perspective, it does not matter in reasoning with the concept how the unspecified graph is represented provided it is unique to the concept. However, in modeling scientific reasoning, one has to take into account that each school of thought may have

adopted a differing, more specific representation of a particular primitive concept, making a distinction without a difference that can be a source of confusion in the literature.

**Roles**, or relations, are represented by the role name without any surrounding shape.

**Individuals**, or singletons, are represented by the individual name in a rectangle. An individual *exhibits* [15] a property derived from its outgoing arrows as for concepts, which may be conceptualized as the concept encoding its current *state*.

A collective individual or **set** is represented by an extensional constraint, and possibly an identifying name, in a rectangle with inset vertical lines at each end. The constraint is specified through upper and lower cardinality and inclusion bounds on the collection as detailed in [3] where it was shown that such bounds may be conceptualized as defining generalized sets or mereological collections having well defined unions, intersections and complements, and forming a subsumption lattice under inclusion ordering (I have not yet found an elegant graphical representation of the bounds, and hence have left these defined in textual form within the node). Sets are important in representing role fillers, co-reference and inclusion constraints, and, when defined by comprehension, material implications or rules. The notation for an individual may be regarded as a shorthand for a set with cardinality 1 (consistent with the Quine/Scott [17/18] extensional simplification of set theory that  $a = \{a\}$ ). Thus there are basically only three types of nodes: concepts, roles and mereological sets. The node type “ $\exists$ ” is provided as a shorthand for the cardinality constraint “ $\geq 1$ ”.

**Arrows** between nodes derive their semantics from the types of the nodes they connect.

An arrow from concept A to concept B means that concept A is defined to be **subsumed** by concept B. The equivalent graph-theoretic interpretation is that the arrow may be replaced by copying the graph of outgoing arrows from concept B to concept A (including the unspecified graph of a primitive concept).

An arrow from individual A to concept B means that A is asserted to be an **instance** of B and again may be given a graph-theoretic interpretation as a copy operation.

An arrow from an individual A or a set A to a set B means that A is contained in B. This can be used to specify co-reference and inclusion constraints. An arrow from a concept A to a set B means that any individual comprehended by A is contained in B. This has the corollary that a **rule**, or material implication, may be represented as a set with a incoming arrow from a premise concept and an outgoing arrow to a conclusion concept.

Multiple arrows from a node are taken as specifying a **conjunction** of properties. This convention necessitates the introduction of a special node, “ $\vee$ ”, specifying a **disjunction**, with the convention that outgoing arrows from this specify a disjunction of properties. The graph-theoretic interpretation is one of multiple alternative graphs each having one of the branches of the disjunction, and disjunction nodes can always be eliminated by such expansion resulting in multiple, alternative definitions of a disjunctive concept.

The conjunctive node type “ $\wedge$ ” is also available to use after a “ $\vee$ ” to disambiguate multi-branch outgoing graphs that are to be treated as a single term in the disjunction.

**Negation** is represented through an arrow with a cross bar having the graph-theoretic interpretation that the graph at the end of the arrow must *not* occur. This gives rise to the standard semantics for negation, including De Morgan’s laws linking conjunction, disjunction and negation. A negation arrow from a concept to a set may be used to represent a rule with exceptions [19].

An **existential** constraint is specified through a set with an arrow to a concept applying to the individuals included in it.

If a graph contains a conjunction/disjunction of two identical graphs then one of the conjuncts/disjuncts may be deleted.

## 2.3 Models, satisfaction and subsumption

A concept definition is **coherent**, or consistent, if all the set bounds specified in it are consistent and there is no conjunction in it of an arrow and a negation arrow pointing to the same graph.

A **model** satisfying an ontology defined in the visual language is a collection of individuals satisfying all the existential constraints such that their resulting states are coherent.

One ontology is **extensionally subsumed** by another if any model satisfying it also satisfies the other. This definition gives rise to the standard denotational, extensional, model-theoretic semantics for description logics, and may be used to show that the graph-theoretic operations of the visual language conform with the standard extensional semantics of description logics.

We may also introduce the notion of intensional or structural subsumption as a sub-graph relation, that one ontology is **intensionally subsumed** by another if that other ontology is a sub-graph of it. It follows immediately that intensional subsumption implies extensional subsumption, but not necessarily *vice versa*.

However, the definition of intensional subsumption needs strengthening. First, a semantic network may be conceptualized as a *meta-graph* that specifies a set of equivalent graphs derivable from it by expansion, contraction and other logical operations. One ontology intensionally subsumes another if its graph at any stage of expansion or contraction is a sub-graph of the other at any stage of expansion or contraction. One could state this in terms of full expansions to a canonical form but for computational purposes the definition given is more useful, particularly since recursive definitions give rise to infinite graphs.

Second, the labels given to non-primitive concepts are arbitrary from a logical perspective, so that any remapping of labels that preserves non-identity may be used in computing structural subsumption. This corresponds to the notion that different terms are being used for the same concept, and is important in the analysis of scientific definitions since it often happens that different terminology has been used for essentially the same concept. Mapping primitives to one another is a deeper operation since it would imply that their tacit definitions are the same, and is also important to the process of finding explications of the primitives. A good example is the way in which the application of biological evolutionary theory to processes in other disciplines has led to the abstraction of the principles of variety generation and selective filtering underlying a general process of ‘evolution.’

Third, the semantics of set constraints have not been specified in graphical form, but their subsumption lattice is well-defined so that one needs to extend the notion of sub-graph to be one in which a set matches another if it subsumes it.

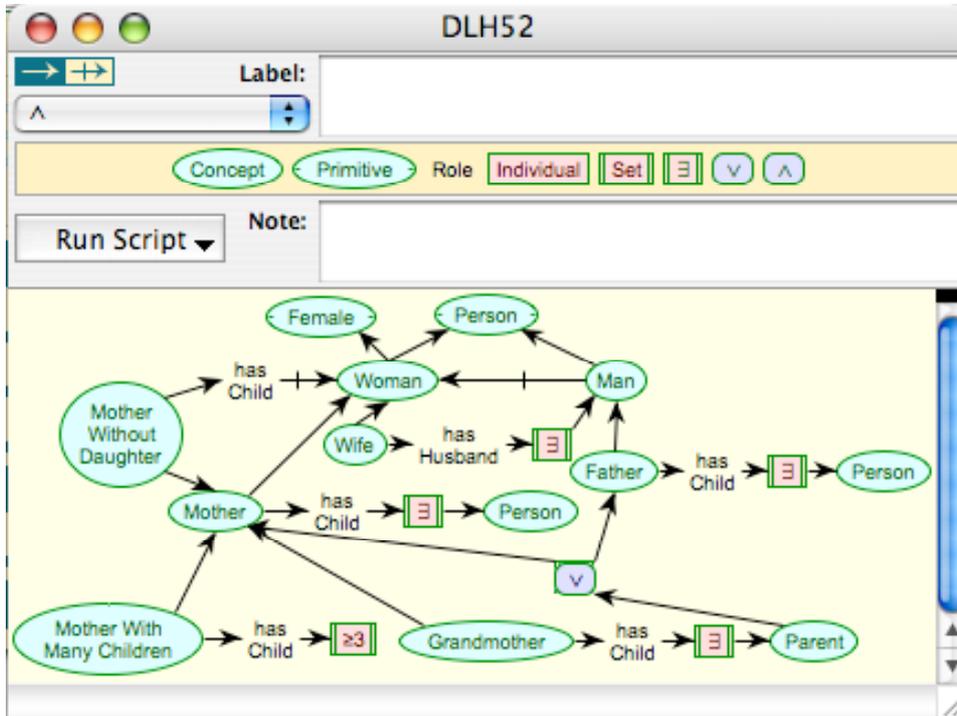
## 3 Some Examples

In order to illustrate some of the issues, this section takes the following simple ontology from *The Description Logic Handbook* [6, p.52] and shows how it may be manipulated in KNet.

Woman	=	Person $\sqcap$ Female	(1)
Man	=	Person $\sqcap$ $\neg$ Woman	(2)
Mother	=	Woman $\sqcap$ $\exists$ has_Child.Person	(3)
Father	=	Man $\sqcap$ $\exists$ has_Child.Person	(4)
Parent	=	Father $\sqcup$ Mother	(5)
Grandmother	=	Mother $\sqcap$ $\exists$ has_Child.Parent	(6)
Mother_With_Many_Children	=	Mother $\sqcap$ $\geq 3$ has_Child	(7)
Mother_Without_Daughter	=	Mother $\sqcap$ $\forall$ has_Child. $\neg$ Woman	(8)
Wife	=	Woman $\sqcap$ $\exists$ has_Husband.Man	(9)

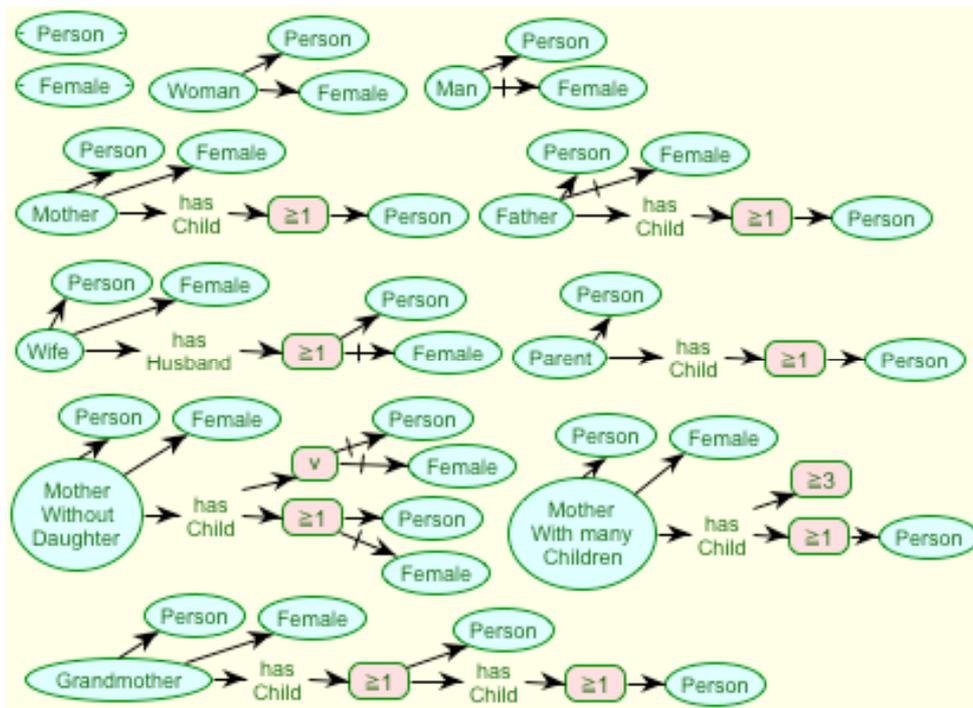
**Figure 1 Simple ontology of family relationships [6, p.52]**

Fig.2 shows the ontology of Fig.1 represented as a semantic network in KNet.



**Figure 2 Ontology of Figure 1 in KNet**

Figure 3 is equivalent to Figure 2, and derived from it by expanding all defined constructs, pushing negation to terminal nodes, and excising contradictory branches from disjunctions. These are all transformations that a representation system will probably make in transforming the definitions into an internal normal form, and they are also of help to the user in understanding the ontology.



**Figure 3 Expanded ontology of Figure 2**

Some problems with the ontology defined in Figure 2 are apparent in Figure 3. “Mother Without Daughter” and “Mother With Many Children” are not defined as expected because they encompass situations in which a child is not a person. The problem may be viewed as arising from the definition of “Mother” that has “Person” after an existential quantifier, and it could be avoided by moving “Person” back to be a universal quantifier of the “has Child” role. However, this would have the consequence in recognizing a “Mother” that all her children would have to be checked to be people when it is intended that only the existence of one need be checked.

These problems are arising because the ontology of Figure 2 avoids the use of the natural recursive definition that the “has Child” role of a person must be filled by a person. However, this is an innocuous use of recursion since the concept “Person” is a primitive that can only be asserted of an individual, not recognized as applying to it, and hence the recursive definition acts only as a constraint that needs propagating through a graph up to its existing terminal nodes, not expanded indefinitely beyond them.

Fig. 4 shows an alternative ontology with the recursive definition, and Fig. 5 shows that it leads to the expected definitions after expansion.

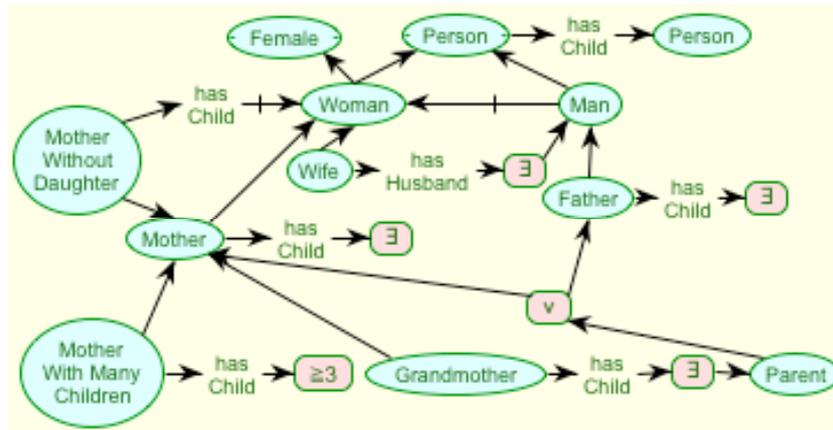


Figure 4 Alternative ontology to Figure 1

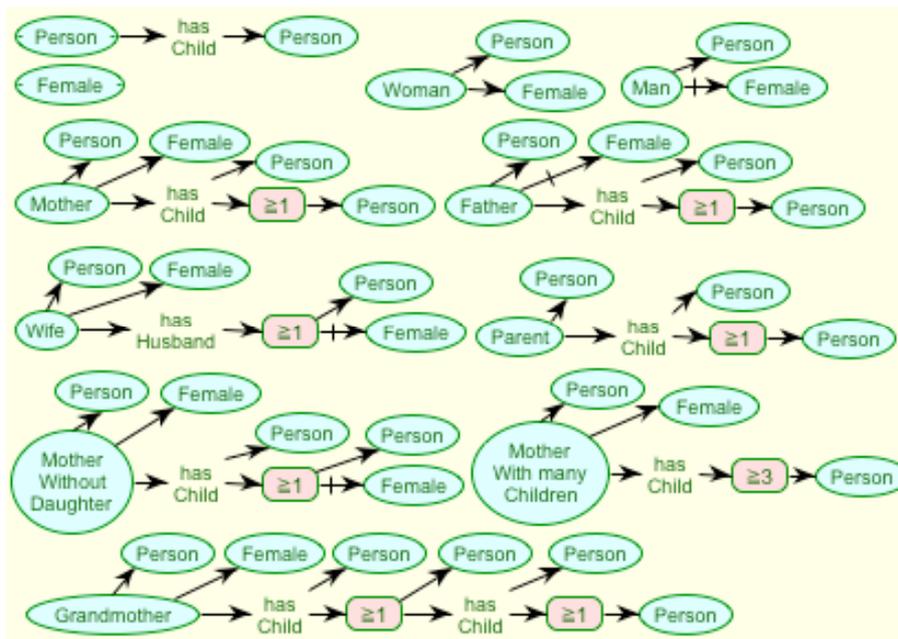


Figure 5 Expanded ontology of Figure 4

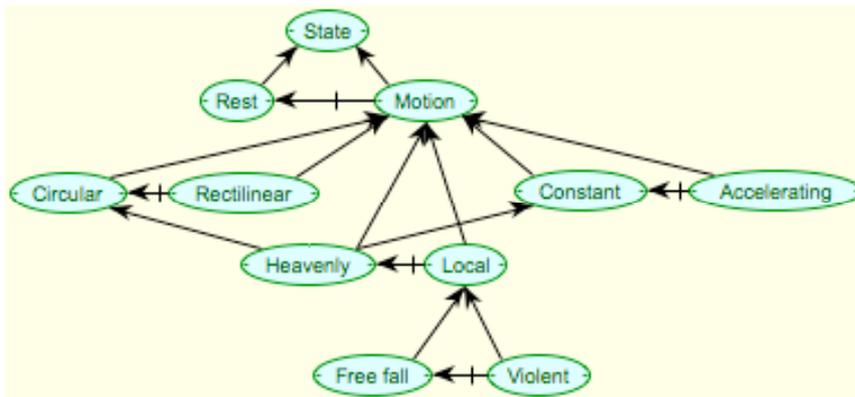
Fig. 5 looks somewhat cluttered with “Person” terminals, and the user might wish to limit the expansion by specifying that those implicit in the recursive definition are not shown, in effect that the “has Child” role of a person is implicitly filled by a person. Nine uses of “Person” can be dropped in Fig. 5 while preserving its equivalence to Fig. 4.

The point of this discussion to illustrate how various transformations of a ontology may affect the understanding of it, and need to be supported through decision logic inference and graphical interaction. Users need to be able to move back and forth between readily understood equivalent representations, much as does the inference engine. It is interesting to see how the defined subsumptions in Fig.4 are clearly visible to users as inferable subsumptions in Fig. 5 through subgraph relationships. Users also need to be able to compare the effects of changes that do affect meaning such as those between Fig.2 and Fig.4.

The situation becomes more complex as inferences are made that go beyond the restructuring discussed so far, for example, if it is the A-Box that is being graphed and extensional case-by-case reasoning has been applied or rules have fired. KRS graphs the results of such reasoning as additions as to the original graph after “infer” nodes, but makes no attempt to “explain” them. CLASSIC provides a form of explanation of terminological reasoning [20] and this together with more recent developments [21,22] suggest approaches which it would be interesting to implement as modules providing graphical output through semantic networks.

In its applications to presenting output from clustering algorithms, KNet provides an interactive interface whereby users can adjust what parts of a graph are shown by moving a slider to change a threshold. It would be interesting to take output from an inference engine in a *proof markup language* [23] and have a slider that moved through a linear representation of the proof steps while showing the resulting inferences being graphed in the semantic network.

Figure 6 provides a simple example of the distinctions made in Aristotle’s mechanics that led to problems that medieval scientists attempted to resolve with little progress until their reconstruction by Galileo facilitated their explication by Newton [24]. The state of an object was seen to be either one of rest or one of motion, and several states of motion were distinguished. One that was well-grounded in experience but problematic in the development of a unified science of motion, was the distinction between heavenly and local bodies. The problems generated by this distinction without a difference were greatly exacerbated by making circular, constant motion part of the definitional essence of heavenly motion, thus requiring no explanation in terms of material conditionals or ‘laws of motion.’



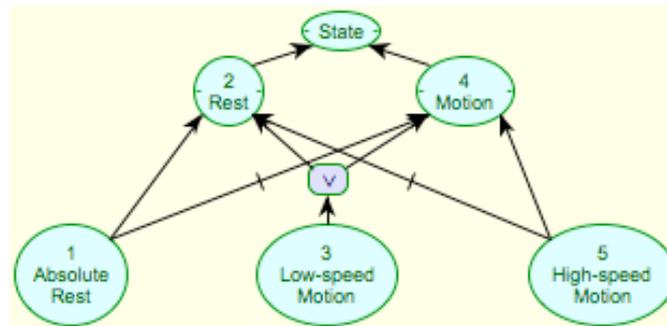
**Figure 6 Distinctions in medieval mechanics**

Medieval scientists accepted the heavenly—local distinction and the lack of need to explain the ‘perfection’ of heavenly motion, and focused on problems with the behavior of bodies in free-fall motion, that they accelerated, and ones in ‘violent’ motion, such as projectiles, that they continued in the direction in which they were projected even though they had lost contact with the projector. This led to explanations in terms of notions such as impressed ‘impetus’ [24].

Galileo dropped the distinction between heavenly and local bodies and between free fall and violent motion, but introduced new problems through the notion that the earth itself was moving and yet this had no apparent effect on objects in free fall. One can track the changing ontologies and laws from Aristotle through Buridan and Oresme to Copernicus and Galileo and hence to Descartes, Huygens, Hooke, Newton *et al*, as the gradual reduction of primitives in the ontologies of motion and their replacement by the material implications which we now know as Newton's 'laws of motion' [24].

## 4 The Transition from Logical Opposition to Numeric Scales

One important phenomenon in the development of scientific reasoning is the way in which qualitative distinctions become refined to be graded distinctions, eventually becoming numeric scales of observable measured with ever-increasing precision [25]. We can model this process in a description logic by introducing the natural symmetry of an opposition, that it is generally conceived as based on two opposing concepts of equal status rather than one and its negation as in Figs. 2, 4 and 6. The resultant structure turns out to have the properties of a multi-point scale.



**Figure 7 From an opposition to a five-point scale**

Fig. 7 exemplifies this process. The opposition between the primitives, rest and motion, is modeled by the extremes of absolute rest and high-speed motion which inherit from one concept and the negation of the other. This leads to a natural five-point scale as three other concepts are interpolated between them, the two primitives and their disjunction. Seven and nine-point scales may be developed from this by adding another concept such as 'extreme value.' Once the logical possibility of grading the opposition has been realized it is natural to look for quantities to measure that correlate with the scale and provide further gradations.

## 5 Supporting Paraconsistent Reasoning

In the literature on modeling scientific reasoning it has been argued that inconsistencies are often present but do not cause "explosive" growth of conclusions through the *ex falso quodlibet* derivations of classical logic [7]. Hence it has been proposed that paraconsistent logics are needed to account for scientific reasoning [26]. However, uniform paraconsistency is not desirable since many major achievements in the scientific literature, such as Arrow's impossibility theorem, result from proofs of definitional inconsistency, and Rips' psychological studies show that people readily generate *reductio ad absurdum* arguments to solve logic problems [27].

Batens has proposed and developed *adaptive logics* that default to classical behavior in the absence of inconsistency, but behave paraconsistently in its presence [28]. Description logics are well-suited to be foundations for such logics if the reasoning is factored appropriately. The major example of *ex falso quodlibet* in description logics is that any incoherent definition is subsumed by any other. However, structural subsumption based on graph-matching does not lead to this conclusion. It has to be imposed separately. KRS [3] would happily report that a

Meinongian *green, round, square* entity, where *round* and *square* were declared disjoint primitives, was subsumed by *green, round* or *square* but not by *red*, provided that the additional inference step of noting that the definition was incoherent and mapping it to bottom was not taken.

Tableaux proofs by refutation obviously rely on such mapping but extensions to tableaux methods have been described which support inconsistency-adaptive logics [29] and it would be interesting to investigate how these might be incorporated in description logics.

A reasonable target architecture might be an inference engine with a user-interface through semantic networks and control over the proof methods such that one can see the impact of various methods in terms of the proofs generated and the inferences made. Normalization and structural subsumption might provide a model of the inference patterns that have led to incoherent definitions being accepted by scholarly communities for long periods of time, with inferences being made despite the contradictions. Stronger proof methods might provide a model of the anomaly detection that leads to a change in the conceptual framework marking a minor or major “scientific revolution.”

## 6 Conclusions

Description logic technology, with visual language interfaces and control of proof techniques, provides very valuable tools for understanding the knowledge processes of current and past scholarly communities. Much of the current research on the support of the semantic web is directly applicable since the sub-disciplines of science are known to form a “semantic web” of inter-dependencies and provenances. It may be that some additional constructions will be needed, but the advances of recent years in description logic research make it reasonable to expect that it will be feasible to add them.

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