A mereological theory of frames of reference

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Abstract

In this paper a mereological theory of frames of reference is presented. It shows that mereology extended by the notion of granularity and approximation is sufficient to provide a theory for location based features of frames of reference. More complex theories, taking also into account orientation and metric properties can be built as extensions of the presented theory. In order to take the hierarchical organization of frames of reference into account we introduce the notion of stratified approximation to facilitate transformations between different levels of granularity. This paper shows that the ontological grounding of the theory of frames of reference into mereology allows us to give a clear semantics to the notion 'degree of parthood' which is central to the notion of approximation. It also shows how epistemic aspects which affect the use of frames of reference help us to understand the feature of epistemic vagueness and the way it affects the notions of approximation and of degree of parthood.

1. Introduction

This paper proposes a mereological theory of frames of reference. There is a broad body of literature on frames of reference in at least four major areas: (i) in physics, in particular in the contexts of mechanics and relativity New26, Ein51, DiS02; (ii) in linguistics, where people are interested in the semantics of spatial prepositions and in the insights into human cognition, which language can provide Lev96, Tal83, Her86; (iii) in psychology where, for instance in work in the distinction between fi gure and ground in human cognition Smi85; and (iv) in artifi cial intelligence in attempts to formalize human reasoning about space and time Her94, Fra92, Sch95.

Mereology *Les92,LG40,Sim87*, the formal theory of parthood, has not, hitherto, been held to provide a basis for theorizing about frames of reference. This is probably because the most salient features of frames of reference are characterized by ordering relations and metric properties, features which require theories much stronger than mereology for their formalization. Examples of metric frames of reference are the ones used in physics to measure distance, weight, temperature, etc. Examples of frames of reference based on ordering relations are those of cardinal directions (N,S,E, and W), the distinction between left and right relative to your body axis, clock and calendar time, etc. However it will turn out that mereology with only some extensions will be sufficient to formally describe locational frames of reference.

This paper will show that mereology can help us to understand the more basic features of frames of reference which are already pointed to by the Gestalt psychologists in their distinction between fi gure and ground Smi^{85} . Here the ground is seen as a frame of reference in which the fi gure is located. An important point here is that the ground, if it is to provide a frame of reference must have a relatively simple structure, which, as we shall show, can be understood in terms of mereology. In order to use mereology as a formal foundation, however, it must be extended by the feature of granularity. We will refer to this theory as 'granular mereology'. (See also SB02 for further arguments along these lines.)

Since frames of reference are often quite coarse, as in the case of the frame of reference which divides your surroundings into the part in front of you and the part behind, the specifi cation of location of the fi gure within its ground (or of the referenced object within the frame of reference) is often *rough or approximate*. In this respect we will build upon the theory of granular partitions by BS03a . It will turn out that the resulting formalism is quite close to the notions of rough sets Paw91 and rough mereology PS96 , which are extensions of set theory and mereology developed in the context of data analysis and data mining.

One important feature of frames of reference is heir hierarchical organization. An example is the tree-like structure formed by the subdivision of London into Borroughs such as Westminster, Camden, etc at one level of granularity and parks and neighborhoods like Hyde Park, Soho, etc. at another level of granularity. Within a frame of reference based on this tree structure the relation between entities and the frame of reference, i.e., between fi gure and ground, can be specifi ed at multiple levels of granularity.

Consider the sentences

A 'John is in Hyde Park'

B 'The Rocky Mountains are in the Western United States'.

Here hierarchically ordered systems of places are used as frames of reference. As an alternative to (A) one can say, for example:

A' John is in London.

And to (B) one can say

 \mathbf{B}'

The Rocky Mountains are partly located in Montana, Idaho,

Wyoming, Nevada, Colorado, Utah, Arizona, and New Mexico.

Given formal representations of the location of entities within a frame of reference it is often necessary to transform approximations between different levels of granularity. The notion of stratified approximation introduced below will facilitate these kinds of transformations.

It is important to distinguish between: (a) the study of the nature and the formal structure of frames of reference, and (b) the study of their application in certain contexts. This is because (a) refers to the study of the *formal ontology* of frames of reference. (b), on the other hand, refers to the question of how *epistemic issues*, for example issues pertaining to the limits on human knowledge and the representation of human knowledge, affect the specification of location in frames of reference and our capability to switch between levels of granularity in the ways illustrated in (A, A') and (B, B'). From the perspective of formal ontology approximations with respect to a frame of reference are rough but *crisp*. Epistemic issues then give, as we shall see, raise to

vagueness.

Vagueness hereby is understood in the sense that there are multiple, equally good, approximations which are consistent with the knowledge at hand. This epistemic understanding of vagueness needs to be distinguished from semantic vagueness which affects the ways names like 'Mount Everest' refer to parts of the surface of Earth Fin75, Var01, BS03b. We refer to the latter as to *semantic* vagueness and to the former as to *epistemic* vagueness. Since in this paper we exclusively focus on epistemic vagueness it will be often sufficient to use the term vagueness.

In order to provide a mereological theory that addresses the points raised above we start by extending mereology in order to take into account the feature of granularity. We then give a very general formal account of levels of granularity. In the following section we introduce the notion of approximation and show how stratifi ed approximations can be defined across multiple levels of granularity. We then discuss epistemic issues that give raise to vagueness and extend the crisp formalism of stratifi ed approximation in order to take epistemic vagueness into account. In the end we discuss related work and give the conclusions. The examples we use throughout the paper will be mostly spatial in nature. Due to its general nature, the underlying theory can easily be extended to domains of other sorts.

2. Frames of references as granular partitions

In this section I give a formal definition of frames of reference as an extension of the theory of granular partitions which was originally introduced in BS03a .

2.1. Frames of reference

A frame of reference is a triple,

$$G = \langle (Z, \subseteq), (\Delta, \leq), \pi \rangle$$

 (Z, \subseteq) is a *cell structure* with a partial ordering defined by \subseteq which forms a finite tree. (Δ, \leq) is the *target domain* which is a partial ordering which satisfies the axioms of extensional closure mereology (CEM)^{Var96}. The projection mapping $\pi : Z \to \Delta$ is an order-homomorphism from Z into Δ .

Before going into details, let us consider some examples. In figure 1 some cell structures of frames of reference popular in artificial intelligence are shown. Part (i) shows nine cells of a cell structure with ten cells (the tenth, which has all cells represented in the figure as subcells, is omitted here) are shown. When projected onto the surface of the Earth in such a way that the horizontal lines are in line with lines of longitude, the vertical lines are in line with lines of latitude, and the cell labeled 0 coincides with the location of some entity x, then the regions carved out by projecting of the cells onto the surface of the Earth are called 'North of x', 'Northeast of x, and so on. The entity x and the portions of Earth carved out in the way described are parts of the target domain Δ . The spatial projection of the cells onto the surface of Earth is a specific form of the projection π . The frame of reference as a whole is formed by the three components: cell structure, target domain, projection. For an extended discussion of this specific family of frames of reference see Fra92.

The cell structure in part (ii) of the fi gure is projected onto its target domain in such a way that a particular entity (often a human being) is located at the intersection of the two diagonal lines in such a way that front, back, left and right are interpreted relative to the entity in the center in the way indicated in the picture. The frame of reference again is formed by three components: the cell structure depicted in the fi gure (again the maximal cell containing all cells as subcells is omitted), the target domain, and the projection of the cell structure onto the target domain. For an discussion of frames of reference depicted in (iii) see Fre92.



Figure 1: Frames of reference used by Frank (i), by Hernandez (ii), and by Freksa (iii).

Frames of reference are not necessarily based on ordering relations. Consider fi gures 2 and 3. The left part of Figure 2 shows a tree with minimal cells labeled 'a', 'b', 'c', 'd', 'e', 'f' and non-minimal cells labeled 'r', 's', 't', 'u'. We have 's' \subseteq 'r', 't' \subseteq 's', etc. The targets of the cells are regions which are shown in Figure 3, e.g., $\pi(`a`) = a, \pi(`b`) = b$, etc. (The target of the root cell, which is the plane as a whole, is omitted here.)

Figure 2: A tree structure with levels of granularity



Figure 3: Depictions of the levels of granularity $\delta_1, \delta_2, \delta_{\min}$.

In the remainder of this section we discuss the components of frames of reference from a mereological perspective in greater detail. For this purpose we assume a sorted fi rst order predicate calculus with identity. We distinguish variables $c, q, d, d_1, g, g_1, \ldots$ ranging over cells, and variables x, x_1, y, z, \ldots ranging over entities of some target domain Δ .

2.2. Cell structures

Let (Z, \subseteq) be a cell structure. Using the primitive subcell relation \subseteq we define the relations proper subcell (D_{\subseteq}) , immediate proper subcell $(D_{\overline{\subseteq}})$, cell-overlap (D_{OC}) and predicates for the root cell (D_{root}) and for atoms (D_{At}) :

$$\begin{array}{ll} D_{\subset} & c \subset g \equiv c \subseteq g \And \neg(c = g) \\ D_{\overline{\subseteq}} & c \overline{\subseteq} g \equiv c \subset g \And \neg(\exists d) (c \subset d \And d \subset g) \\ D_{OC} & OC \ cg \equiv (\exists d) (d \subseteq c \And d \subseteq g) \\ D_{root} & \operatorname{root}(c) \equiv (\forall g) (g \subseteq c) \\ D_{At} & At \ c \equiv \neg(\exists g) (g \subset c) \end{array}$$

In this subsection the quantification ranges over cells in Z. Here and in the remainder of the paper leading quantifiers are omitted. The proper subcell relation $c \subset g$ holds if c is a subcell of g but c and g are distinct entities. The cell c is an immediate subcell of g if and only if c is a proper subcell of g and there is no proper subcell between them. $OC \ cg$ is the relation of overlap between cells. The predicates *root* and At hold if the entity to which they are applied is the root of a tree structure or an atom, i.e., a cell without proper subcells.

The subcell relation \subseteq is governed by the following axioms:

$$\begin{array}{ll} (\mathrm{TM1}) & c \subseteq c \\ (\mathrm{TM2}) & (c_1 \subseteq c_2 \& c_2 \subseteq c_1) \Rightarrow c_1 = c_2 \\ (\mathrm{TM3}) & (c_1 \subseteq c_2 \& c_2 \subseteq c_3) \Rightarrow c_1 \subseteq c_3 \\ (\mathrm{TM4}) & (\exists c) \mathrm{root}(c) \\ (\mathrm{TM5}) & OC \ c_1 c_2 \Rightarrow (c_1 \subseteq c_2 \ \mathrm{or} \ c_2 \subseteq c_1) \\ (\mathrm{TM6}) & c \subset g \Rightarrow (\exists d) (d \subset g \& \neg OC \ cd) \\ (\mathrm{TM7}) & (\exists g) (At \ g \& g \subseteq c) \\ (\mathrm{TM8}) & \neg At \ d \Rightarrow (\exists c_1, \ldots, c_n) ((\bigwedge_{1 \leq i \leq n} c_i \subset d) \& \\ & (g)g \subset d \Rightarrow \bigvee_{1 < i < n} g = c_i)) \end{array}$$

Here TM1-3 ensure that \subseteq is a partial ordering. In TM4 we demand that there is a root cell which has all cells in Z as subcells. Using TM2 we can then prove that there exists exactly one root. TM5 rules out the possibility of partial overlap of cells. From this it follows that there cannot occur any cycles and the resulting structure is a tree. TM6 rules out cases where a cell has only a single proper subcell. TM6 is known in the literature as the weak supplementation principle Sim87. TM7 ensures that every cell has at least one atom as subcell. Finally TM8 is an axiom schema which ensures that every cell is either an atom or has fi nitely many subcells.

Using TM1, TM5, and TM6 we then can prove that the strong supplementation principle (SSP) holds (T1). The SSP tells us that if c is not a subcell of g then there

exists a d which is a subcell of c and which does not overlap g. From SSP then immediately follows the extensionallity of overlap (T2).

$$\begin{array}{ll} T1 & \neg(c \subseteq g) \Rightarrow (\exists d) (d \subseteq c \And \neg OC \ dg) \\ T2 & c = g \Leftrightarrow (w) (OC \ wc \Leftrightarrow OC \ wg) \end{array}$$

The extensionallity principle (T2) tells us that if that if whatever cell overlaps c also overlaps g then c and g must be identical. From this it follows that there cannot be distinct cells which coincide in the same sense in which the city of Vienna and the Austrian Federal State of Vienna coincide.

One can see that axioms TM1-TM8 constrain cell structures to be finite trees. Consequently, we have the following metatheorem:

Metatheorem 1 The class of models of axioms (TM1-TM8) is identical to the class of finite trees.

2.3. Target domain

 (Δ, \leq) is the *target domain* which is taken to be a partial ordering which satisfi es the axioms of extensional closure mereology V^{ar96} . Based on the primitive \leq we define the relations of proper parthood and overlap among entities in the target domain:

$$D_{<} \quad x < y \equiv x \leq y \& \neg (x = y)$$

DO
$$O xy \equiv (\exists z)(z \leq x \& z \leq y)$$

In this section quantification ranges over entities in the target domain Δ .

We continue by defining the sum of two entities x and y in Δ as the entity z which is such that anything overlaps z if and only if it overlaps x or y. Similarly we define the product of two entities x and y as the entity z which is such that anything overlaps z if and only if it overlaps x and y.

$$\begin{array}{ll} (D+) & x+y=z\equiv (w)(O\ wz\Leftrightarrow (O\ wx\ {\rm or}\ O\ wy))\\ (D*) & x*y=z\equiv (w)(P\ wz\Leftrightarrow (P\ wx\ \&\ P\ wy)) \end{array}$$

In addition to reflexivity, antisymmetry, and transitivity (referred to by M1-M3) the parthood relation is characterized by the following axioms:

$$\begin{array}{ll} M4 & \neg P \, xy \Rightarrow (\exists z) (P \, zx \, \& \, \neg O \, zy) \\ M5 & (\exists z)(w) (O \, wz \Leftrightarrow (O \, wx \text{ or } O \, wy)) \\ M6 & O \, xy \Rightarrow (\exists z)(w) (P \, wz \Leftrightarrow (P \, wx \, \& \, P \, wy)) \\ M7 & (\exists y)(x)x \leq y \end{array}$$

M4 is the strong supplementation principle. M5 and M6 ensure that binary sums exist for arbitrary entities in Δ and that a product of two entities x and y exists whenever both entities overlap. M7 ensures that there exists a universe of which everything in Δ is a part. Using M4 we can then prove that sums, products, and the universe are unique if they exist. One can also prove that summation is associative and hence it is permissible to write fi nite sums of the form $x = x_1 + \ldots + x_n$. As in the domain of cells we can prove that the extensionallity principle holds (T3). There might be domains in which this is too strong, dealing with such issues however requires a more elaborate theory, which is beyond the scope of the present paper.

$$T3 \quad x = y \Leftrightarrow (w) (O \ wx \Leftrightarrow O \ wy)$$

2.4. Projection

The relationship between cell structure and target domain is established by the binary relation of projection, Π , which holds between cells and entities. Corresponding to Π there is a converse relation $\overline{\Pi}$ holding between entities and cells. Using these primitive relations we can define their functional counterparts.

$$\begin{array}{ll} D_{\pi} & x=\pi \; c\equiv \Pi \; cx\\ D_{\overline{\pi}} & c=\overline{\pi} \; x\equiv \overline{\Pi} \; xc \end{array}$$

Projection is then governed by the following axioms:

$$\begin{array}{ll} GM1 & \Pi \ cx \ \& \ \Pi \ cy \Rightarrow x = y \\ GM2 & \Pi \ c_1 x \ \& \ \Pi \ c_2 x \Rightarrow c_1 = c_2 \\ GM3 & \Pi \ cx \Leftrightarrow \overline{\Pi} \ xc \\ GM4 & (\exists x)(\Pi \ cx) \\ GM5 & c_1 \subseteq c_2 \Leftrightarrow (\pi \ c_1) \le (\pi \ c_2) \end{array}$$

GM1 and GM2 ensure that Π is a one-one mapping. GM3 introduces $\overline{\Pi}$ as the converse of Π . GM4 makes Π a total function and GM5 ensures that π preserves the ordering structure.

From D_{π} , $D_{\overline{\pi}}$, and GM1-4 then immediately follows that π and $\overline{\pi}$ behave like inverse functions wherever $\overline{\pi}$ is defined (T4 and T5). Using GM3, GM5, D_{π} , $D_{\overline{\pi}}$, T1 we then can prove (T6) which tells us that π is indeed an order homomorphism. We then prove (T7) and (T8) using T1, GM5, and T6. This tells us that both π and $\overline{\pi}$ preserve the tree structure.

 $\begin{array}{ll} T4 & c = \overline{\pi}(\pi \ c) \\ T5 & (\exists c)(\overline{\Pi}xc) \Rightarrow x = \pi(\overline{\pi} \ x) \\ T6 & ((\exists c)(\Pi \ cx_1) \ \& \ (\exists c)(\Pi \ cx_2)) \Rightarrow (x_1 \leq x_2 \Leftrightarrow \overline{\pi} \ x_1 \subset \overline{\pi} \ x_2) \\ T7 & \neg c_1 \subset c_2 \Rightarrow (\exists z)(z \leq (\pi \ c_1) \ \& \neg O \ z(\pi \ c_2)) \\ T8 & ((\exists c)(\Pi \ cx_1) \ \& \ (\exists c)(\Pi \ cx_2)) \Rightarrow \\ & \{\neg x_1 \leq x_2 \Rightarrow (\exists d)(d \subset (\overline{\pi} \ x_1) \ \& \neg O \ d(\overline{\pi} \ x_2))\} \end{array}$

Theorems T6-T8 tell us that if we are only interested in those entities in Δ which are targeted by cells in Z and mereological relations between those entities then it is sufficient to refer to the cell structure as a proxy for the more complex target domain.

3. Levels of granularity

Let $G = \langle (Z, \subseteq), (\Delta, \leq), \pi \rangle$ be a frame of reference with cell structure (Z, \subseteq) . Metatheorem 1 tells us that we now can talk about cell structures in the same way as we talk about finite trees. Let \mathcal{G} be the tree representation corresponding to the cell structure (Z, \subseteq) . We then can specify a frame of reference as $G = \langle \mathcal{G}, (\Delta, \leq), \pi \rangle$, where \mathcal{G} is a finite tree, and (Δ, \leq) and π are target domain and projection as discussed above. Consequently, we can talk about cell structures at the level of models rather than at the level of the formal theory.

The advantage of talking about finite trees rather than about cell structures is that we can use a set-theoretic language and standard mathematical notation in order to talk about trees. This makes the whole formalism much simpler.

3.1. Properties of levels of granularity

Let $G = \langle \mathcal{G}, (\Delta, \leq), \pi \rangle$ be a frame of reference with tree structure \mathcal{G} . **Definition 1** A cut δ is a cut in the tree-structure \mathcal{G} is a subset of Z defined inductively as follows ^{RS95}:

- (1) $\{r\}$ is a cut, where r is the root of the tree;
- (2) For any cell z let d(z) denote the set of immediate subcells of z and let C be a cut with $z \in C$ and $d(z) \neq \emptyset$, then $(C - \{z\}) \cup d(z)$ is a cut.

We can now define levels of granularity as cuts in the tree structure. For example the levels of granularity in the tree structure in the left of Figure 2 are listed in the right part of the figure.

Using Definition 1 and (TM1-8) we can prove that the cells forming a level of granularity are pair-wise disjoint (T9) and that levels of granularity enjoy a weak form of exhaustiveness in the sense that every cell c in Z is either a subcell or a supercell of some cell c' in the level of granularity δ at hand (T10) ^{*RS*95}.

$$T9 \quad (g_1 \in \delta \& g_2 \in \delta) \Rightarrow (OL g_1 g_2 \Rightarrow g_1 = g_2)$$

$$T10 \quad (\exists c')(c' \in \delta \Rightarrow (c \subseteq c' \text{ or } c' \subseteq c))$$

Definition 1 captures only certain necessary conditions that characterize levels of granularity at the most basic level: pairwise disjointness and weak exhaustiveness, two properties which are purely mereological in nature. More specific characterizations of levels of granularity may include constraints on the type of entities that form the level of granularity. For example consider a cell structure targeting a human being. One level of granularity might contain only biomolecules where another might contain only tissues or only organs. Definition 1 in its basic form admits any kind of mixture of different kinds of things to forming a level of granularity provided only that they satisfy the properties listed in definition 1. In other cases it might be useful to include also metrical notions, for example in order to require that objects forming a certain level of granularity fall into a certain range of magnitudes Don01. For the purpose of this paper, however, the presented definition will be sufficient.

3.2. The granularity ordering

Let δ_1 and δ_2 be levels of granularity in a given granularity tree. We define an ordering relation $\delta_1 \ll \delta_2$ as follows:

$$D_{\ll} \quad \delta_1 \ll \delta_2 \equiv (c)(c \in \delta_1 \Rightarrow (\exists g)(g \in \delta_2 \& c \subseteq g))$$

Using TM1-3 and the extensionallity of sets we can prove that \ll is a partial ordering using induction over the underlying tree structure:

$$\begin{array}{ll} T11 & \delta \ll \delta \\ T12 & \delta_1 \ll \delta_2 \& \delta_2 \ll \delta_1 \Rightarrow \delta_1 = \delta_2 \\ T13 & \delta_1 \ll \delta_2 \& \delta_2 \ll \delta_3 \Rightarrow \delta_1 \ll \delta_3 \end{array}$$

This ordering includes at one extreme the level of granularity which consists only of the root cell as maximal element and at the other extreme the level of granularity formed by atomic (or leaf) cells as minimal element. The former is the coarsest level of granularity and the latter is the fi nest level of granularity. The corresponding structure is called the *granularity ordering* of \mathcal{G} .

The granularity ordering now insures that, given levels of granularity $\delta_i \ll \delta_j$, then there exists a mapping $\ell_{ij} : \delta_i \to \delta_j$ such that:

$$D_{\ell} \quad \ell_{ij} \ c = d \equiv c \in \delta_i \ \& \ d \in \delta_j \ \& \ c \subseteq d$$

Using D_{ℓ} , D_{\ll} , T9 and T10 we then can prove that ℓ_{ij} is indeed a total and surjective mapping (T14-T16).

$$\begin{array}{ll} T14 & \ell_{ij} \ c = d_1 \ \& \ \ell_{ij} \ c = d_2 \Rightarrow d_1 = d_2 \\ T15 & (\delta_i \ll \delta_j \ \& \ c \in \delta_i) \Rightarrow (\exists d) (d = \ell_{ij} \ c) \\ T16 & (\delta_i \ll \delta_j \ \& \ d \in \delta_j) \Rightarrow (\exists c) (d = \ell_{ij} \ c) \end{array}$$

3.3. Mereological commulativeness

We can now distinguish two classes of levels of granularity: commulative and noncommulative. The former are levels of granularity which are such that the targets of their cells sum up to the target of the root cell. The levels of granularity in Figures 2 and 3 are of this type. We call such levels of granularity *commulative* BS03a .

On the other hand there are levels of granularity which do not have this property. An example of a non-commulative frame of reference which is formed by the cells Hyde Park, Soho, Buckingham Palace, Downtown, London, York, Edinburgh, Glasgow, England, Scotland, Great Britain, Germany, Europe and the corresponding nesting, as given in Figure 4.



Figure 4: A place-based frame reference with non-commulative levels of granularity.

As another example, consider the frame of reference yielded by taking Figures 2 and 3 but deleting *a* as minimal cell and by assuming that the root cell covers the whole

plane and that δ_1 and δ_2 sum up to δ_0 . In this case the level δ_{\min} fails to sum up to the whole plane and in particular the cell *b* fails to sum up to the cell $t \in \delta_2$. Instead of the cell *a* we have 'empty space' or a hole (which can be thought of as space we know nothing about).

Formally we define commutativeness as follows. Let G be a frame of reference with tree representation \mathcal{G} . A level of granularity δ in \mathcal{G} is commutative if and only if the mereological sum of the targets of its cells is identical to the the target of the root-cell in the underlying frame of reference:

$$D_{\text{Com}} \quad Com(\delta) \equiv \delta = \{z_1, \dots, z_n\} \& (\exists z)(root(z) \& (\pi z) = \pi z_1 + \dots + \pi z_n).$$

Obviously, the root cell is always commulative. A frame of reference is commulative if and only if all of its levels of granularity are commulative. Otherwise it is non-commulative. For further discussion see BS03a .

4. Approximate location in a frame of reference

4.1. Exact location

Let $G < (Z, \subseteq), (\Delta, \leq), \pi >$ be a frame of reference and let x be an entity of the target domain Δ . We say that the *location* of x in G is the cell c if and only if c projects onto $x (D_L)$. This means that location is just another name for the converse of projection:

$$D_L \quad L \ xc \equiv \overline{\Pi} \ xc$$

We then can prove that L satisfies the following axioms of a location relation^{CV95}:

$$T17 \quad L xc \& L xd \Rightarrow c = d$$

$$T18 \quad x < y \& L xc \& L yd \Rightarrow c \subset d$$

From our definitions it immediately follows that location is a *partial* relation. In fact most of the entities of the target domain Δ will not be located in the frame of reference in the way described above. This is hardly surprising since otherwise the frame of reference would be as complex as the target domain itself. It follows that we need a more general relation in order to characterize the relationship between entities in the target domain and the relevant frame of reference.

4.2. Rough approximation

We start by defining additional relations between entities in Δ :

$$\begin{array}{ll} DDR & DR \; xy \equiv \neg O \; xy \\ DPO & PO \; xy \equiv O \; xy \; \& \; \neg x \leq y \; \& \; \neg y \leq x \\ DNSO & NSO \; xy \equiv PO \; xy \; \text{or} \; x < y \end{array}$$

Two entities are disjoint if and only if they do not overlap (DDR). Two entities overlap partially if and only if they overlap but neither is part of the other (DRPO). Two entities are in the relation of non-symmetric overlap if and only if they overlap partially or the fi rst is a proper part of the second.

We now can prove that, for arbitrary entities x and y in the target domain, one and only one of the relations DR xy, NSO xy, or $y \le x$ holds:

$$\begin{array}{ll} T19 & DR \ xy \ {\rm or} \ NSO \ xy \ {\rm or} \ P \ yx \\ T20 & \neg (DR \ xy \ \& \ NSO \ xy) \\ T21 & \neg (DR \ xy \ \& \ P \ yx) \\ T22 & \neg (NSO \ xy \ \& \ P \ yx) \end{array}$$

Let $G = \langle \mathcal{G}, (\Delta, \leq), \pi \rangle$ be a frame of reference with tree structure \mathcal{G} . Coarsening is a structure of granularity δ in the underlying frame of reference, and a mapping X of signature $X : \delta \to \Omega$, where Ω is a totally ordered set of three values fo \rangle po \rangle no :

$$D_{Appr} \quad Appr \ x \delta X \equiv (c) (c \in \delta \Rightarrow ((X \ c) = \text{ fo } \Leftrightarrow (\pi \ c) \le x \& \\ (X \ c) = \text{ po } \Leftrightarrow NSO \ x(\pi \ c) \& (X \ c) = \text{ no } \Leftrightarrow DR \ x(\pi \ c)))$$

We call fo, po, and no *approximation values* and X an *approximation mapping*. We then each prove that accesses with respect to a given level of granularity

We then can prove that coarsening with respect to a given level of granularity is unique:

T23 Appr
$$x\delta X$$
 & Appr $x\delta X' \Rightarrow X = X$

Hereby we say that two mappings are identical if and only if their domains and codomains are identical and identical entities in the domain are mapped to identical entities in the co-domain. Since coarsening is unique we can define a *coarsening function*:

$$D_{appr}$$
 $appr x\delta = X \equiv Appr x\delta X$

Often we consider only a fixed level of granularity. We then either write δ as a subscript or omit it completely (i.e., we write $appr_{\delta} x = X$, or appr x = X instead of $appr_{\delta} x = X$). If we apply the convention to use non-capitalized variables x, y, z for entities and capitalized variables X, Y, Z for the corresponding approximation mappings then we can omit the reference to the coarsening function *appr* completely and write X in order to refer to the rough approximation of the entity x. Sometimes we will use the notation X^{δ} in order to refer to the approximation of the entity x with respect to the level of granularity δ .

Consider the approximation X and let δ be the underlying level of granularity and let $c \in \delta$. The value of X c is fo if π c is a part of x, it is po if x overlaps some but not all of π c, and it is no if there is no overlap between x and π c. Consider, for example the approximation of the entities s and q in Figure 5 (iii). Given the level of granularity $\delta = \{a, b, c, d, e, f\}$ we have (S a) = po, (S b) = fo, and (Q b) = no.

Based on the notion of coarsening we now define an equivalence relation between entities in the target domain Δ in terms of identity of approximation:

$$D_{\sim} \quad x \sim_{\delta} y \equiv appr \, x\delta = appr \, y\delta$$

From D_{Appr} and D_{\sim} it follows immediately that \sim_{δ} is reflexive, symmetric, and transitive (T24-T26)

$$\begin{array}{ll} T24 & x \sim_{\delta} x \\ T25 & x \sim_{\delta} y \Rightarrow y \sim_{\delta} x \\ T26 & x \sim_{\delta} y \& y \sim_{\delta} z \Rightarrow x \sim_{\delta} z \end{array}$$



Figure 5: Rough location of the regions q, s, v, t and z within the levels of granularity δ_1 , δ_2 , and δ_{\min} .

In Figure 5 (iii) we have $z \sim_{\delta_{min}} v$. In Figure 5 (i) we have $z \sim_{\delta_1} v \sim_{\delta_1} q \sim_{\delta_1} t$. In the remainder we omit the subscript where there is no danger of confusion.

An important feature of frames of reference is the fact that they provide means for a certain sort of abstracting or economizing information. That is, we can talk about entities in the target domain not in terms of their exact location but rather in terms of approximations. Entities with identical approximations cannot be distinguished. This significantly simplifies the structure of the target domain and facilitates approximate reasoning ^{BS98,Bit02,BS02}.

4.3. Stratified approximations

Frames of reference have a hierarchical structure and therefore entities can be approximated at different levels of granularity. We saw examples in natural language in sentences A and A' and B and B' in the introduction and we also saw this in the example depicted in figure 5. We now introduce the notion of stratified approximations in order to to capture these features of frames of reference formally.

Let $G = \langle \mathcal{G}, (\Delta, \leq), \pi \rangle$ be a frame of reference with levels of granularity $\delta_1, \ldots, \delta_n$; let G be mereologically commulative, i.e., Com $\delta_1 \& \ldots \& Com \delta_n$; and let x be an entity of the target domain Δ . We have unique approximations $X^{\delta_1}, \ldots, X^{\delta_n}$ at different levels of detail (T23).

Let $\omega_{ij}^p = \{X^{\delta_i} k \mid (\ell_{ij} k) = p\}$ be the set of approximation values under (X^{δ_i}) with respect to the subcells $k \in \delta_i$ of the cell $p \in \delta_j$. Whenever $\delta_i \ll \delta_j$ we define a generalization mapping $\alpha_{ij} : \Omega \to \Omega$ with

$$D_{\alpha_{ij}} \quad (\alpha_{ij} \ (X^{\delta_i})) \ k = \begin{cases} \text{fo} & \text{iff} \quad \omega_{ij}^{(\ell_{ij} \ k)} = \{ \text{ fo} \} \\ \text{no} & \text{iff} \quad \omega_{ij}^{(\ell_{ij} \ k)} = \{ \text{ no} \} \\ \text{po} & \text{otherwise} \end{cases}$$

We can then prove the following:

T27
$$\delta_i \ll \delta_j \Rightarrow (c)(c \in \delta_i \Rightarrow (x)((\alpha_{ij} (appr_{\delta_i} x)) c = ((appr_{\delta_i} x) \ell_{ij}) c)$$

Theorem (T27) tells us that the following two ways of computing generalizations of approximations yield the same result:

1. We first map the cell c in δ_i to its supercell in δ_j by means of ℓ_{ij} and then apply X^{δ_j} , i.e., we perform the composition of the mapping ℓ_{ij} and X^{δ_j} .

2. We first map the cell *c* onto its approximation value and then generalize the approximation by means of α_{ij} , i.e., we perform the composition of the mapping X^{δ_i} and α_{ij} .

In the first case we perform the generalization on the level of cells and in the second case we perform the generalization on the level of approximation values. This is equivalent to saying that the following diagram commutes:



Following Yao99 and BS03c we now define:

Definition 2 A stratified approximation is a family of approximations $X^{\delta_1}, \ldots X^{\delta_n}$, such that whenever $\delta_i \ll \delta_j$ we have $(k)(k \in \delta_i \Rightarrow (\alpha_{ij} (X^{\delta_i})) k = ((X^{\delta_j}) \ell_{ij}) k)$. Stratified approximations allow us to represent entities in the target domain at different levels of granularity.

5. Epistemic vagueness and rough approximation

Approximations are *crisp* in the sense that within a given level of granularity for every x there exists a *unique* approximation X (T23). For every approximation there exists a unique generalization mapping to every coarser level of granularity (T27). Moreover, it is completely clear which entities can be distinguished with respect to the underlying approximation and which are equivalent.

However frames of reference are artifacts of human cognition and their *application* in concrete situations is subject to limitations of human knowledge. In this section we will discuss three different sources of epistemic vagueness that arise due to different kinds of limitations of human knowledge:

- 1. Limitations of knowledge about relations between an entity x and entities targeted by the cell tree \mathcal{G} . This can be caused by limitations of our observations or by limitation of knowledge about the projection.
- 2. Limitations of granularity of knowledge: The approximation at hand is too coarse.
- 3. Limitations of knowledge about the underlying frame of reference: The underlying frame of reference might be non-commulative in the sense defined in (D_{Com}) .

Epistemic vagueness hereby is understood in the sense that there are multiple, equally good, approximations which are consistent with the knowledge at hand.

5.1. Vagueness from observations

When using frames of references in a concrete situation knowledge about relations between an entity targeted by the cell tree, πc , and an entity x is typically gained by observations. Here it might be impossible to observe which of the relations holds: $DR(\pi c)x$ or $SNO(\pi c)x$ or $x \leq (\pi c)$. The property of joint exhaustiveness and pairwise disjointness of these relations (T19-22) supports the specification of knowledge at coarser levels of granularity by means of disjunctions.

Either the entities πc and x overlap, i.e., SNO $(\pi c)x$ or $x \leq (\pi c)$

- or: πc is not a part of x, i.e., $SNO(\pi c)x$ or $DR(\pi c)x$
- or: the relation between the entities in question is completely unknown, i.e., $DR(\pi c)x$ or $SNO(\pi c)x$ or $x \leq (\pi c)$.

Notice, that in all these cases we represent knowledge, i.e., true justified beliefs, rather than mere (false) belief.

5.2. Vagueness from lack of resolution

Knowledge about approximation is often limited in the sense that for a given entity x of the target domain Δ only the approximation X^{δ_i} is known, where δ_i is relatively coarse level of granularity.

Consider Figure 6. Here we have entities, x_1, x_2, x_3 in our target domain Δ , which are approximated within a frame of reference consisting of five cells: z, z_1, z_2, z_3, z_4 such that $\delta_0 = \{z\}$ and $\delta_1 = \{z_1, z_2, z_3, z_4\}$. The level of granularity δ_1 is mereologically commulative, i.e., $(\pi z) = (\pi z_1) + (\pi z_2) + (\pi z_3) + (\pi z_4)$. The entity x_1 has the approximation $X_1^{\delta_0} z = \text{po}$. One can easily verify in Figure 6 that we have $X_1^{\delta_0} = X_2^{\delta_0} = X_3^{\delta_0}$ but $X_1^{\delta_1} \neq X_2^{\delta_0}, X_2^{\delta_0} \neq X_3^{\delta_0}$ and $X_1^{\delta_1} \neq X_3^{\delta_0}$.



Figure 6: How vagueness arises in commulative frames of reference.

Now chose some x with approximation $X^{\delta_0} z = po$ and assume that all we know about x is this approximation. At the level of granularity δ_0 we cannot say whether x is distinct from x_1, x_2 , and x_3 since all entities are equivalent in the sense that they cannot be distinguished. At a finer level of granularity we might potentially be in a position to distinguish x from some of the x_i since the x_i have distinct and incompatible approximations at this level of granularity.

However if all we know is the coarse approximation X^{δ_0} then the approximation of the entities x_1 , x_2 , and x_3 at the level of granularity δ_1 are consistent with X^{δ_0} .

Therefore, for example, x could be like x_1 or like x_2 or like x_3 , in the sense that from all we know about x it could have the approximations $X^{\delta_1} = X_1^{\delta_1}$, or $X^{\delta_1} = X_2^{\delta_1}$, or $X^{\delta_1} = X_3^{\delta_1}$.

Consequently, if we transform approximations from a coarse level of granularity to a finer then epistemic vagueness arises. That is, disjunctions of possible relations that can hold between the targets of the cells of the finer level of granularity and the entity to be approximated arise.

5.3. Vagueness from non-commutativeness

Above we have shown that given an approximation X^{δ_i} with respect to a mereologically commulative level of granularity δ_i then there exists always a unique generalization mapping to coarser levels of granularity δ_j with $\delta_i \ll \delta_j$. If we give up the assumption that the underlying level of granularity is commulative, then unique generalization mappings do not necessarily exist any more.

To see this consider Figure 7. Here we have entities, x_1, x_2, x_3 in our target domain Δ , which are approximated within a frame of reference consisting of four cells: z, z_1, z_2, z_3 such that $\delta_0 = \{z\}$ and $\delta_1 = \{z_1, z_2, z_3\}$. Here δ_1 is mereologically *non-commulative*, i.e., $(\pi z_1) + (\pi z_2) + (\pi z_3) + (\pi z_4) < (\pi z)$.

In Figure 7 (b) we have an entity x_2 with approximation $(X_2^{\delta_1} z_i) = fo$ for $1 \le i \le 3$. This is consistent with $(X_2^{\delta_0} z) = fo$ as one would normally expect, but it is also consistent with $(X_2^{\delta_0} z) = po$ – the case depicted in Figure 7 (b). Consequently, given the approximation $(X_2^{\delta_1} z_i) = fo$, a disjunction of possible generalizations exist. Similar is the situation in Figure 7 (c) where we have an entity x_3 with approximation $(X_3^{\delta_1} z_i) = no$ for $1 \le i \le 3$. This approximation is consistent with $(X_3^{\delta_0} z) = no$ as one would normally expect, but it is also consistent with $(X_3^{\delta_0} z) = no$ - the case depicted in Figure 7 (b). Consequently, given the approximation $(X_2^{\delta_1} z_i) = no$ a disjunction of possible generalizations exist.



Figure 7: How vagueness arises in non-commulative frames of reference.

6. Vague approximation

Limits of human knowledge cause epistemic vagueness regarding the approximation of entities within a frame of reference. Epistemic vagueness hereby means that the relationships between entities in the target domain entities (also in the target domain) targeted by cells of the frames of reference are characterized by disjunctions of possible relations rather than by one of the crisp relations specified in D_{appr} . We now introduce the notion of vague approximation in order to reflect this phenomenon on the formal level. It follows that this notion will be applicable to deal with the different sources of vagueness discussed in the previous section. The presented formalism is a generalization of the crisp approach discussed above.

6.1. Vague approximation and crisping

Let $G < \mathcal{G}, (\Delta, \leq), \pi >$ be a frame of reference. *Vague* approximation, *CAppr* is a ternary relation between an entity x in the target domain Δ , a level of granularity δ in the tree structure \mathcal{G} of the underlying frame of reference, and a mapping \tilde{X} of signature $\tilde{X} : \delta \to \tilde{\Omega}$, where $\tilde{\Omega}$ is the set {{ fo }, { po }, { no }, { fo , po }, { po , no }, { fo , po , no }}. Sets of values here represent disjunctions of possible approximation values. To get an intuition assume that *CAppr* holds for the entity x, the level of granularity δ , and let \tilde{X} be a mapping of signature $\tilde{X} : \delta \to \tilde{\Omega}$. Then the result of applying \tilde{X} to a cell $c \in \delta$ is interpreted as a disjunction of possible relations between x and (πc) . For example, the value of $(\tilde{X} c)$ is { po , no } if either x covers some but not all of the interior of (πc) or if there is no overlap between x and (πc) .

The elements of Ω are ordered by the subset relation. We obtain a lattice structure by taking the lattice operations join and meet to be set union and intersection and by adding the empty set as bottom element: $(\tilde{\Omega} \cup \emptyset, \cup, \cap)$. These operations generalize to operations on finite sets $\bigcup A$ and $\bigcap A$ in the standard way.

Let $CR \subset (\delta \to \Omega) \times (\delta \to \tilde{\Omega})$ be a binary relation between crisp and vague approximations interpreted as ' X^{δ} is a *crisping* of \tilde{X}^{δ} '. We define:

$$D_{CR} \quad CR \ X^{\delta_1} \ddot{X}^{\delta_2} \equiv \delta_1 = \delta_2 \ \& \ (c) (c \in \delta_1 \Rightarrow (X^{\delta_1} \ c) \in (\ddot{X}^{\delta_2} c)).$$

This means that X^{δ} is a crisping of \tilde{X}^{δ} if and only if for all cells *c* of the underlying granularity level δ we obtain $(X^{\delta} c)$ by choosing one element of $(\tilde{X}^{\delta} c)$. For example, if we have $CR X \tilde{X}$ and $(\tilde{X} c) = \{ \text{po}, \text{no} \}$ then (X c) = po or (X c) = no. We say that the vague approximation \tilde{X} is crisp if and only if it has only a single crisping:

$$D_{crisp} \quad crisp \ \tilde{X} \equiv (X)(Y)(CR \ X\tilde{X} \& \ CR \ Y\tilde{X} \Rightarrow X = Y)$$

Using the definitions D_{appr} and D_{\sim} we can then immediately prove theorem (T28). This tells us that in fact in D_{crisp} we quantify over individuals of the target domain rather than over mappings, i.e., higher order entities.

T28
$$crisp \ \hat{X} \Leftrightarrow (x)(y)(CR \ (appr \ x) \ \hat{X} \ \& \ CR \ (appr \ y) \ \hat{X} \Rightarrow x \sim y)$$

Vague coarsening then is a ternary relation, *CAppr* $x\delta X$, which holds if and only if the approximation $(appr_{\delta} x)$ is a crisping of \tilde{X}^{δ} :

$$D_{CAppr}$$
 CAppr $x\delta \tilde{X} \equiv CR (appr_{\delta} x)\tilde{X}^{\delta}$

It is important to notice that (a) *CAppr* is not a function, i.e., there may be multiple coarsenings for the same entity; that (b) not every crisping of a vague approximation of x is an approximation of x; and that therefore (c) identity of vague approximation does not imply equivalence between the entities approximated by the crispings.

Nevertheless, we continue to use non-capitalized variables x, y, z for entities and capitalized variables $\tilde{X}, \tilde{Y}, \tilde{Z}$ for vague approximations and write \tilde{X}^{δ} in order to refer to *some* vague approximation of the entity x at the granularity level δ . Sometimes we will also omit the superscript.

6.2. Stratified vague approximations

Let δ_i be a *non*-commulative level of granularity and let $\omega_{ij}^d = \{ (\tilde{X}^{\delta_i} c) \mid (\ell_{ij} c) = d \} \subset \mathcal{P}\tilde{\Omega}$ be the set containing the sets of approximation values under \tilde{X}^{δ_i} with respect to the cells $\{ c \in \delta_i | (\ell_{ij} c) = d \}$. Whenever $\delta_i \ll \delta_j$ we define a mapping $\tilde{\alpha}_{ij} : \tilde{\Omega} \to \tilde{\Omega}$ with:

$$D_{\tilde{\alpha}_{ij}} \qquad (\tilde{\alpha}_{ij} \, \tilde{X}^{\delta_i}) \, k = \begin{cases} \{ \text{po} \} & \text{if} \quad \bigcap \omega_{ij}^{(\ell_{ij}k)} = \{ \text{po} \} \\ \{ \text{no} \,, \, \text{po} \} & \text{if} \quad \bigcap \omega_{ij}^{(\ell_{ij}k)} = \{ \text{no} \} \\ \{ \text{fo} \,, \, \text{po} \} & \text{if} \quad \bigcap \omega_{ij}^{(\ell_{ij}k)} = \{ \text{fo} \} \\ \{ \text{po} \,, \, \text{fo} \} & \text{if} \quad \bigcap \omega_{ij}^{(\ell_{ij}k)} = \{ \text{po} \,, \, \text{fo} \} \\ \{ \text{no} \,, \, \text{po} \} & \text{if} \quad \bigcap \omega_{ij}^{(\ell_{ij}k)} = \{ \text{no} \,, \, \text{po} \} \\ \{ \text{no} \,, \, \text{po} \,, \, \text{fo} \} & \text{if} \quad \bigcap \omega_{ij}^{(\ell_{ij}k)} = \{ \text{no} \,, \, \text{po} \,, \, \text{fo} \} \\ \{ \text{po} \,\} & \text{if} \quad \bigcap \omega_{ij}^{(\ell_{ij}k)} = \{ \text{no} \,, \, \text{po} \,, \, \text{fo} \} \end{cases}$$

Here $\bigcap \omega_{ij}^{(\ell_{ij}k)}$ is the intersection of the sets of approximation values in $\omega_{ij}^{(\ell_{ij}k)}$. Consider, again, Figure 7 (b). Assume that we have $(\tilde{X}_2^{\delta_1} z_i) = \{ \text{ fo } \}$ for $1 \le i \le 3$ and $\delta_1 \ll \delta_0$. In this case $\omega_{10}^{(\ell_{10} z_i)}$ is the set $\{\{ \text{ fo } \}\}$. Consequently we have $(\tilde{\alpha}_{10} \tilde{X}_2^{\delta_i}) z = \{ \text{ fo }, \text{ po } \}$ which corresponds to our intuitions discussed above and the fact that the underlying level of granularity is non-commulative.

We then can prove that $\tilde{\alpha}$ preserves the crisping relation, i.e., if X is a crisping of \tilde{X} then (αX) is a crisping of $(\tilde{\alpha} \tilde{X})$ (T29)

T29
$$CR XX \Rightarrow CR (\alpha X)(\tilde{\alpha} X)$$

This is obviously much weaker that the result we had in the crisp case in form of theorem (T27). However theorem (T29) tells us that if \tilde{X} is a vague approximation of the entity x then so is the generalization of \tilde{X} .

In mereologically *commulative* levels of granularity we are able to define a slightly stronger version of the generalization mapping $\tilde{\alpha}$. This is because, if δ_i is commulative and \tilde{X}^{δ_i} is crisp in the sense of D_{crisp} , then the vague generalization coincides with the (crisp) generalization mapping α defined in D_{α} . We then define $\hat{\alpha}$ as the vague generalization mapping which takes the distinction between commulativeness and non-commulativeness of the underlying level of granularity into account:

$$D_{\hat{\alpha}_{ij}} \qquad (\hat{\alpha}_{ij} \ (\tilde{X}^{\delta_i})) \ k = \begin{cases} (\alpha \ X^{\delta_i}) \ k & \text{if } Com \ \delta_i \ \& \ crisp \ X^{\delta_i} \ \& \ CR \ X^{\delta_i} X^{\delta_i} \\ (\tilde{\alpha} \ \tilde{X}^{\delta_i}) \ k & \text{otherwise} \end{cases}$$

Whenever δ_i is commulative and \tilde{X}^{δ_i} is crisp we apply crisp generalization mapping λ to the single crisping of \tilde{X}^{δ_i} . Otherwise we apply we apply $\tilde{\alpha}$ as usual.

Definition 3 A vague stratified approximation is a family of approximations $\tilde{X}^{\delta_1}, \ldots \tilde{X}^{\delta_n}$, such that, whenever $\delta_i \ll \delta_j$, we have $(k)(k \in \delta_i \Rightarrow (\hat{\alpha}_{ij} \ (\tilde{X}^{\delta_i})) \ k = ((\tilde{X}^{\delta_j}) \ \ell_{ij}) \ k)$.

Consequently, vague stratified approximations are such that approximations at a finer level of granularity can be transformed to an approximation at a coarser level of granularity in such a way that the following diagram commutes.

$$\begin{array}{c} \delta_{j} & \longrightarrow & \tilde{\Omega} \\ \uparrow & & \uparrow \\ \ell_{ij} & & \uparrow \\ \delta_{i} & \longrightarrow & \tilde{\Omega} \end{array}$$

Notice, however, that for a single entity of the target domain there might exist multiple vague stratified approximations.

6.3. Refinement

The notion of vague approximation allows us to define refinement from coarser to finer levels of granularity. Obviously, if all we have is knowledge about approximation at a coarse level of granularity then refinement adds vagueness in the sense defined above. Formally we define refinement as a mapping $\beta : \tilde{\Omega} \to \tilde{\Omega}$ as follows:

$$D_{\beta} \qquad \begin{array}{l} (\beta \ \tilde{X}) \ h = \omega_2 \equiv (\tilde{X}g) = \omega_1 \ \& g \subseteq h \ \& g \in \delta_i \ \& h \in \delta_j \ \& \\ (i) \qquad \text{if } \omega_1 = \{ \ \text{no} \ \} \ \text{then} \ \omega_2 = \omega_1 \ \& \\ (ii) \qquad \text{if } \text{po} \in \omega_1 \ \text{then} \ \omega_2 = \{ \ \text{no} \ , \ \text{po} \ , \ \text{fo} \ \} \ \& \\ (iii) \qquad \text{if } \omega_1 = \{ \ \text{fo} \ \} \ \text{then} \ \omega_2 = \omega_1 \end{array}$$

Since g is a subcell of h it follows that: (i) if h does not overlap a given region r then neither does g; and (ii) if h is a part of r then so is g. Vagueness arises only in cases where r and h partially overlap. This is because in this case r and g may or may not overlap. In fact r may even contain g. For refi nement, mereological commulativeness does not need to be considered, since it is not an additional source for vagueness.

6.4. Degrees of vagueness

Let \tilde{X} and \tilde{Y} be vague approximations then \tilde{X} is of less or equal degree of vagueness than \tilde{Y} if and only if every crisping of \tilde{X} is also a crisping of \tilde{Y} :

$$D_{\Box} \quad \tilde{X} \subseteq \tilde{Y} \equiv (X)(CR(X,\tilde{X}) \Rightarrow CR(X,\tilde{Y})).$$

Here \sqsubseteq is clearly reflexive, transitive, and antisymmetric.

The application of generalization in non-commulative levels of granularity and refi nement increases vagueness in the sense that if generalization and refi nement (refi nement and generalization) transformations are applied successively to the approximation \tilde{X} the resulting approximation is of greater or equal vagueness than \tilde{X} (T30 and T31)

$$\begin{array}{ll} T30 & \tilde{X} \sqsubseteq \left(\hat{\alpha}_{ij} \ \beta_{ji} \right) \tilde{X} \\ T31 & \tilde{X} \sqsubseteq \left(\beta_{ji} \ \hat{\alpha}_{ij} \right) \tilde{X} \end{array}$$

7. Related work

Related work comes from two major sources: literature about rough sets and literature about frames of reference .

7.1. Rough sets

Crisp approximations as introduced above are a generalization of rough sets P^{aw91} . Rough sets are an extension of set theory and are based on an indiscernibility relation \approx on a set of objects S. Indiscernibility is an equivalence relation and creates a partition of the underlying set into a set of jointly exhaustive and pairwise disjoint subsets. A given subset $X \subseteq S$ can be approximated with respect to the partition of S by means of lower and upper approximations:

$$\begin{array}{ll} D_{\underline{X}} & \underline{X} \equiv \{x \mid [x] \subseteq X\} \\ D_{\overline{X}} & \overline{X} \equiv \{x \mid [x] \cap X \neq \emptyset\} \end{array}$$

The lower approximation of a set X is the set of all x such that the equivalence class of x with respect to \approx is a subset of X. The upper approximation of X is the set of all x such that its equivalence class [x] has a non-empty intersection with X.

In the above we have used a mereological framework but we can interpret the target domain Δ as a set and entities as subsets of Δ . The difference between our approach and the rough set approach is that we start with a tree structure and levels of granularity within this tree. A level of granularity is the counterpart of the partition induced by the indiscernibility relation in the rough set approach. Sets forming levels of granularity are pairwise disjoint (T9) and exhaustive in a weak sense (T10). They are, however, not necessarily exhaustive in the strong sense in which a partition induced by an equivalence relation exhausts a set. This is because levels of granularity are not necessarily commulative. For commulative levels of granularity one can prove the equivalence of stratifi ed (i.e., hierarchically ordered) rough sets and approximations within frames of reference ^{B S03c}.

In terms of the presented formalism one can define lower and upper approximations as follows:

$$\begin{array}{ccc} D_{\underline{X}} & \underline{\underline{X}}^{\delta} \equiv \Sigma y [y \leq x \ \& \ (\exists c) (c \in \delta \ \& \ y = (\pi \ c))] \\ D_{\overline{\underline{Y}}} & \overline{\overline{X}}^{\delta} \equiv \Sigma y [O \ yx \ \& \ \& \ (\exists c) (c \in \delta \ \& \ y = (\pi \ c))] \end{array}$$

 $\Sigma y[y \le x \& (\exists c)(c \in \delta \& y = (\pi c))]$ is interpreted as the sum of all y which are parts of x and which are targeted by a cell in δ . Since levels of granularity are by assumption finite, the corresponding sums are finite too, and they can be computed by a finite number of binary summations. We can then establish the relationship between lower and upper approximations and the equivalence relation defined in D_{\sim} by proving theorem (T32).

$$T32 \quad (\underline{X} = \underline{Y} \& \overline{X} = \overline{Y}) \Leftrightarrow x \sim y$$

The approach presented in this paper allows us to take into account more explicitly the nature of frames of reference, their hierarchical structure, and the epistemic issues that come up when frames of reference are applied in specific situations. In particular we discussed several sources of epistemic vagueness which can be identified within the presented. We then further extended the notion of rough sets in order to take vagueness into account.

7.2. Rough mereology

Rough mereology PS96 extends rough set theory by incorporating it into the mereological framework of Lesniewski Les92 . On the other hand it extends mereology by allowing degrees of parthood. Rough parthood, $\mu xy = z$, is a ternary functional relation which is interpreted as 'x is a part of y to the degree of at least z'.

There are no further assumptions on the structure of the domain of values specifying degrees of parthood beyond the fact that it needs to form a complete lattice with minimal and maximal element. For this purpose the unit interval [0, 1] of rational or real numbers is often used. Given a set of entities, the prototypical way of defining degrees of parthood among two classes formed by those entities is to count instances that fall into each of them and then to compute a ratio:

$$D_{\mu_1} \qquad \mu_1 \ XY \equiv \begin{cases} \frac{|X \cap Y|}{|X|} & \text{if } X \neq \emptyset\\ 1 & \text{if } X = \emptyset \end{cases}$$

A closely related approach, which brings the indiscernibility relation \approx underlying rough sets into the picture, is to define of degrees of parthood as

$$D_{\mu_2} \qquad \mu_2 \ xY \equiv \frac{|[x] \cap Y|}{|[x]|}.$$

Here [x] is the equivalence class of entities in X which are indiscernible from x, i.e., $[x] \equiv \{y \in X \mid x \approx y\}.$

There are different variants of this approach (including fuzzy sets Haj98) which have proven to be quite successful for example in data mining applications. For an overview see KPS98 . In the remainder we refer to this approach to rough mereology as 'the data or observation driven approach'.

We now can show that the approach presented in this paper is in fact a special case of rough mereology. We define:

$$\begin{array}{ll} DRP1 & RP \, xy \text{ fo } \equiv P \, xy \\ DRP2 & RP \, xy \text{ po } \equiv RPO \, yx \\ DRP3 & RP \, xy \text{ no } \equiv DR \, yx \end{array}$$

Clearly, fo > po > no form a lattice of the kind demanded above. From this perspective the relations P xy, RPO yx, and DR xy represent different degrees of parthood between x and y. We can then prove that all but one of the axioms of rough mereology are theorems in our framework. The one axiom of rough mereology that is not a theorem is an axiom postulating a *null entity* an entity which is a maximal part of any entity in the domain at hand. Since we assume that the target domains Δ in the presented framework satisfy the axioms of closed extensional mereology (M1-7) there

does not exist a null entity in them.

$$\begin{array}{ll} T33 & \mu \, xyz \, \& \, \mu \, xyz_1 \Rightarrow z = z_1 \\ T34 & \mu \, xx \, \mathrm{fo} \\ T35 & \mu \, xy \, \mathrm{fo} \Rightarrow \mu \, zy \geq \mu \, zx \\ T36 & (\mu \, xy \, \mathrm{fo} \, \& \, \mu \, yx \, \mathrm{fo} \,) \Rightarrow \mu \, xz \geq \mu \, yz \\ T37 & ((z)[\mu \, zx \, \mathrm{fo} \, \Rightarrow (\exists t)(\mu \, tz \, \mathrm{fo} \, \& \mu \, ty \, \mathrm{fo} \,)] \Rightarrow \mu \, xy \, \mathrm{fo} \,) \\ T38 & (u_1, \ldots, u_n)(\exists x)\{(z)[\mu \, zx \, \mathrm{fo} \, \Rightarrow (\exists w)(\exists t)((\bigvee_{1 \leq i \leq n} u_i = t) \Rightarrow (\mu \, wz \, \mathrm{fo} \, \& \mu \, wt \, \mathrm{fo} \, \& \mu \, tx \, \mathrm{fo} \,))]\} \\ T39 & (u_1, \ldots, u_n)(\exists x)(\bigwedge_{1 \leq i \leq n} \mu \, u_i x \, \mathrm{fo} \,) \end{array}$$

We then defi ne

$$\begin{array}{ll} D_{\rho_1} & \rho_1 \ u_1 \dots u_n x \equiv \{(z) [\mu \ zx \ \mathrm{fo} \ \Rightarrow (\exists w) (\exists t) ((\bigvee_{1 \le i \le n} u_i = t) \Rightarrow \\ & (\mu \ wz \ \mathrm{fo} \ \& \mu \ wt \ \mathrm{fo} \ \& \mu \ tx \ \mathrm{fo} \))] \} \\ D_{\rho_2} & \rho_2 \ u_1 \dots u_n x \equiv (\bigwedge_{1 < i < n} \mu \ u_i x \ \mathrm{fo} \) \end{array}$$

and prove

$$T40 \quad (u_1, \dots, u_n)(\exists x)((\rho_1 \ u_1 \dots u_n x \& \rho_2 \ u_1 \dots u_n x) \Rightarrow \mu \ yx \text{ fo })$$

It follows that the presented formalism is a specific version of rough mereology. We call it the ontology driven approach to rough mereology (modulo the existence of the null-entity).

Now compare the data driven and the ontology driven approach. Rough mereology was developed in the context of data analysis and is used in order to discover structures in data sets. In other words its aim is to extract conceptual (and thus to a certain degree ontological) structure from observations. Hereby no specific assumptions are made about the nature of observations, sources of epistemic vagueness, the role of frames of reference, and the role of the granular structure of the underlying domain. This has the consequence that the semantics of the domain describing the degree of parthood tends to be rather abstract and often mixes ontological and epistemic aspects.

This is reflected by a criticism that has often been raised against the data driven approach, namely that the semantics of the values describing degrees of membership is often not clear. What does $\mu XY = 0.7$ mean, beyond sequences of occurrences in data sets? (A parallel criticism can be made in relation to many applications of fuzzy set theory Fre94.)

On the approach pursued in this paper, making explicit the underlying assumptions about the nature of observations, sources of epistemic vagueness, the role of frames of reference, and the role of the granular structure of the underlying domain of entities helps to give a clear semantics for the notion 'degree of parthood'. As we have seen in (DRP1-3), it is very easy to give a specific interpretation of degrees of parthood as disjointness, non-symmetric partial overlap, and parthood. We have seen how, starting out from there one can explore in a systematic fashion the effects of such epistemic factors as limitations of observations, defi ciencies of frames of reference.

7.3. Frames of reference

As argued above, research on frames of reference has been pursued in areas like physics, linguistics, psychology, and artificial intelligence. In the context of this paper we focus on linguistic frames of reference, the figure ground distinction, and AI approaches to frames of reference.

In linguistics it is well recognized that schematization, a process that involves the systematic selection of certain aspects of a referent scene to represent the whole while disregarding the remaining aspects, plays a fundamental role in descriptions of spatial phenomena Tal83. More specifically, schematization is characterized by a distinction between focal or primary object and reference or secondary object. This distinction is closely related to the opposition between fi gure and ground in Gestalt psychology Smi85. "The fi gure is a moving or conceptually movable object whose site, path, or orientation is conceived as a variable the particular value of which is the salient issue. The ground is a reference object (itself having a stationary setting within a reference frame) with respect to which the fi gure's site, path, or orientation receives characterization." Tal83

The formalism presented in this paper reflects the distinction between fi gure and ground in terms of the distinction between levels of granularity (the ground) and entities (the fi gures) which are approximated or whose location is specified with respect to the ground. In language localizing an object (determining its location) is critical and "involves processes of dividing a space into subregions or segmenting it along its contours, so as to narrow in on an object's immediate environment." ^{Tal83}. This corresponds exactly to the approximation (approximate location) is defined in Definition D_{Appr} .

In the AI community there is a wide range of attempts to formalize reasoning that is supported by specific kinds of frames of reference. Consider the approach to cardinal directions by Frank Fra92, or Hernandez' cone-shaped reference frame, or Freksa'a vector based frame of reference. All are defined by a partition of space at a certain level of granularity and the localization of (point-like) entities within those regions. Each formalism gains its reasoning powers from (a) the partition structure of the frame of reference, (b) the location information of the entity or entities in the foreground, and (c) additional specific assumptions about the structure of the frame of reference such as: number of cells, shape of cells, the embedding of the cells in the plane. The assumption that the entities are non-extended points is often made to simplify the representation and reasoning.

In the presented framework we are able to deal with (a) and (b) in a general and unified fashion. Moreover the presented formalism applies to extended entities rather than to idealized points. The proposed stratifications allows us to do justice also to the hierarchical character of frames of references. The importance of exploiting hierarchical structures for reasoning purposes was was pointed out for example in Kui78, CF95. It BS98 it was shown that the mereological union and intersection operations (D_+ and D_*) have corresponding pairs of operations at the level of approximations. It was demonstrated in BS02 and Bit02 how these operations can be used for reasoning purposes.

In the presented framework we do not have the resources to deal with (c) since this requires theories which are stronger than mereology. Ways of extending mereology by topological and morphological principles were discussed for example in ^{Var96}, ^{CV94},

and ^{CBGG97}. Extending the presented theory along those lines is subject of ongoing research.

8. Conclusions

In this paper a mereological theory of frames of reference was presented. We showed that mereology can help us to understand the more basic features of frames of reference which are related to the distinction between fi gure and ground in gestalt psychology. The ground is seen as frame of reference in which the fi gure is located. We showed that mereology extended by the notion of granularity and approximation is sufficient to provide a theory for location based features of frames of reference. More complex theories, taking also into account orientation and metric properties of frames of reference can be built as extensions of the presented theory.

Their hierarchical organization is an important feature of frames of reference. Given approximations of entities within a frame of reference it is often necessary to transform them between different levels of granularity. We introduced the notion of stratified approximation to facilitate those kinds of transformations.

We showed that in the attempt to understand frames of reference there are two important aspects that need to be distinguished: (a) the study of the formal ontology of frames of reference, and (b) epistemic issues that arise when frames of reference are used in specifi c contexts.

The study of the first aspect helps to understand the the role of frames of reference and the importance of their granular structure. The ontological grounding allows us to give a clear semantics to the notion 'degree of parthood' which is central to the notion of approximation. We then showed how making explicit the nature and limitations of observations and properties of the embedding of the frame of reference into the target domain (commulativeness) help us to understand the feature of epistemic vagueness and the way it affects the notion of degree of parthood.

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