

# The State of the Art in Tag Ontologies: A Semantic Model for Tagging and Folksonomies

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## Abstract

There is a growing interest into how we represent and share tagging data in collaborative tagging systems. Conventional tags, meaning freely created tags that are not associated with a structured ontology, are not naturally suited for collaborative processes, due to linguistic and grammatical variations, as well as human typing errors. Additionally, tags reflect personal views of the world by individual users, and are not normalised for synonymy, morphology or any other mapping. Our view is that the conventional approach provides very limited semantic value for collaboration. Moreover, in cases where there is some semantic value, automatically sharing semantics via computer manipulations is extremely problematic. This paper explores these problems by discussing approaches for collaborative tagging activities at a semantic level, and presenting conceptual models for collaborative tagging activities and folksonomies. We present criteria for the comparison of existing tag ontologies and discuss their strengths and weaknesses in relation to these criteria.

**Keywords:** tag; tagging; tagging ontology; folksonomy; semantic tagging

## 1. Introduction

Wikipedia (<http://www.wikipedia.com>) defines a *Tag* as a 'free-text keyword' and *Tagging* as an 'indexing process for assigning tags to resources'. A *Folksonomy* is described as a shared collection of tags used on a certain platform. The term folksonomy defines a user-generated and distributed classification system, emerging through bottom-up consensus (Vander Wal, 2004). Folksonomies became popular on the Web with social software applications such as social bookmarking, photo sharing and weblogs. A number of social tagging sites such as del.icio.us, Flickr (<http://www.flickr.com>), YouTube (<http://www.youtube.com>), CiteULike (<http://www.citeulike.org>) have become popular.

Commonly cited advantages of folksonomies are their flexibility, rapid adaptability, free-for-all collaborative customisation and their serendipity (Mathes, 2004). People can in general use

any term as a tag without exactly understanding the meaning of the terms they choose. The power of folksonomies stands in the aggregation of tagged information that one is interested in. This improves social serendipity by enabling social connections and by providing social search and navigation (Quintarelli, 2005).

The simplicity and ease of use of tagging however, lead to problems with current folksonomy systems (Mathes, 2004). The problems can be classified in two:

- *Local variations*: Tags have little semantics and many variations. Thus, even if a tagging activity can be considered as the user's cognitive process, the resulting set of tags does not always correctly and consistently represent the user's mental model.
- *Distributed variations*: Most tagging systems have their own specific ways of working with and interpreting the meaning of tags. Thus if we want to aggregate tagging data from different applications or services, it's very difficult to find out the meanings and correlations between a sets of tags.

These limitations are due to the lack of a uniform structure and semantic representation found in tagging systems. In this paper, we will compare existing conceptualisations of tagging activities and folksonomies, to assess their merits and thus contribute to future work in this area. Such a conceptualisation, or ontology, is intended to be used in the representation of tagging data in collaborative tagging systems. This paper begins by discussing the reasons why we need Semantic Web technologies for tagging communities. We then briefly overview existing conceptual models for tagging and propose a novel model for folksonomies. We continue by introducing existing tag ontologies and compare them using our conceptual model. Finally, we discuss the results, draw conclusions, and suggest future research areas.

## 2. Folksonomies: Why Semantic Web Technologies?

### 2.1. Tagging and Folksonomies

There have been a significant number of efforts to add more structure and semantics to conventional tagging systems. Approaches to tagging and folksonomies have been dominated by a focus on the (statistical) analysis of tag usage patterns (Golder and Herberman, 2006), information retrieval and navigation (Halpin et al., 2006; Jäschke, 2008) and social network analysis and clustering (Mika, 2005; Brooks et al., 2006) based on tagging data. Golder and Herbermann (2005) collected del.icio.us data and analysed the structure and usage patterns of tagging systems. Their work discusses the distinction between collaborative tagging and taxonomies - although collaborative tagging systems have many limitations in terms of semantics and structures, it provides the opportunity to learn from one another through sharing and organising information. Marlow (2006) found that for certain users, the number of tags can become stable over time, while for others, it keeps growing. Cattuto et. al (2007) observed small world effects by analyzing a network structure of folksonomies from Bibsonomy (<http://www.bibsonomy.org>) and del.icio.us. Their work introduced the notions of clustering and characteristic path length to describe the small world effects. According to the study, folksonomies exhibit a small world structure and have a sort of social network. Mika (2005) carried out a study to construct community-based semantics based on a tripartite model of actors, concepts, and instances. He emphasises the social context for a representation of ontologies and generates the well-known co-occurrence network of ontology learning as well as a novel semantic network based on community relationships using del.icio.us data.

### 2.2. Semantic Web-Based Approaches

There are a number of debates on the merits of folksonomies when compared to ontologies and other structured vocabulary and classification systems. Despite noted differences between folksonomies and ontologies (Shirky, 2005; Hendler, 2007), Semantic Web technologies can be regarded as a complement to folksonomies. As free-text keywords, tags do not have exact

meanings and succumb to linguistic ambiguities and variations including the human error factor. While a user may interpret a tag's semantics through using or reading it, computers cannot automatically understand the meaning, since it is not defined in a machine-readable way (Passant, 2008). Folksonomy systems do not provide a uniform way to share, exchange, and reuse tagging data among users or communities (Kim et al., 2007). With the use of tagging systems in constant increase, these limitations will become evermore critical. As a potential solution, Specia and Motta (2007) propose the integration of folksonomies and ontologies to enrich tag semantics. In particular, Gruber (2007) and Spivack (2005) emphasise the need for folksonomies and ontologies to work together. In general, tag ontologies can contribute in the following three areas:

- *Knowledge Representation Sophistication*: A tag ontology can robustly represent entities and relationships that shape tagging activities. It could make the knowledge structure of tagging data explicit and facilitate the Linked Data (Berners-Lee, 2006) of tagging data on the Web.
- *Facilitation of Knowledge Exchange*: Ontologies enable knowledge exchange among different users and applications by providing reusable constructs. Thus, a tag ontology can be shared and used for separate tagging activities on different platforms.
- *Machine-processable*. Ontologies and Semantic Web technologies in general (knowledge representation, processing and reasoning) expose human knowledge to machines in order to perform automatic data linking and integration of tagging data.

### 3. Conceptualising Tagging and Folksonomies

Before providing a detailed comparison, we start by reviewing individual conceptual models of tagging activities that preceded our own. A tagging model needs to distinguish between entities in a tagging activity that need to be represented, and address the relationships that exist between them. After reviewing existing tagging models we discuss whether the proposed models are suitable to represent collaborative tagging activities. We then propose our extended model, which caters for the collaborative aspect of folksonomies.

#### 3.1. A Model for Tagging Activities

Many researchers (Mika, 2005; Halpin, 2006; Cattuto, 2007) suggested a tripartite model of tagging activities. Although different authors interpret the term "tagging" differently, we can identify three common entities - users, tags, and resources. They form a triple that represents the Tagging Process:

$$\text{Tagging: } (U, T, R) \text{ ----- (1)}$$

where  $U$  is the set of users who participate in a tagging activity,  $T$  is the set of available tags and  $R$  is the set of resources being tagged. Gruber (2005) suggested an extension to model (1):

$$\text{Tagging: } (object, tag, tagger, source, + \text{ or } -) \text{ ----- (2)}$$

where *object*, *tag*, and *tagger* correspond to  $R$ ,  $T$ , and  $U$  in the tripartite model. The *source* refers to the tag space where the tagger applies the set of tags whereas the positive/negative parameter is an attempt to represent the collaborative filtering of 'bad' tags from spammers. This tagging model has successfully been used for representing the tagging process at a semantic level. In fact, most tag ontologies have a Tagging class, based on Gruber's model, as a core concept.

#### 3.2. A Model for Collaborative Tagging Activities

Existing models consider tagging as an activity where an individual user assigns a set of tags to a resource. While they provide effective ways to describe the tagging process, they do not really support collaborative tagging activities. We therefore want to provide a *Folksonomy Model* to

represent this knowledge, where the folksonomy is considered as a collection of instances of the tagging model. Before doing so, we need to clarify the differences between simple (individual) and folksonomy-based tagging practices. Folksonomies are not created independently by individuals in isolation, but collectively by people who participate in the collaborative tagging activity. Thus, the folksonomy model has to cover all the collaborative aspects and relationships in addition to the objects associated with tagging activities. A straightforward model for a Folksonomy could be defined as follows:

**Folksonomy:** (*tag set, user group, source, occurrence*) ----- (3)

where the tag set is the set of all tags being employed, the user group is a set of users who participate in the tagging activity and the source is the location where the folksonomy is utilised (e.g. social web sites, online communities). The fourth parameter, occurrence, plays an important role to identify the tags' popularity. Comparing this model to the tagging model (2), we can identify the following similarities: the resources (objects) are not part of the Folksonomy model per se. The Folksonomy is rather applied to the collective tagging process of the resources. The tag and tagger parameters in (2) have been replaced with a collective representation of these entities – tag set and user group. The source is still unique since a folksonomy is a multi-user approach to tagging on a single platform. In our opinion, filtering should not be represented at this level. Alternatively, given we represent multiple tags in this model, the frequencies of individual tags become important. Thus, we include the occurrence as our fifth parameter.

Contrary to the concept of Tagging, a folksonomy is a method rather than a process in itself. It can be considered as the practice of acquiring knowledge from collaborative tagging processes. In practice this means that the Folksonomy model should include a representation of the collective tagging processes performed by the group of users. We reflect this in (4) by extending (3) to make the individual tagging activities (to which single users contribute) explicit:

**Folksonomy:** (*tag set, user group, source, occurrence, Tagging†*) ----- (4)

where the last parameter reflects the collective tagging processes performed by the users of the folksonomy, where an individual tagging process is represented by:

**Tagging:** (*object, tag, tagger*) ----- (5)

where object, tag and tagger have the same semantics as those in (2). Thus, our Folksonomy model (4) now incorporates a representation for the collective tagging processes that are individually defined by the Tagging model (5).

#### 4. Overview and Comparison of Tag Ontologies

There is no simple criterion for the comparison of tag ontologies. For this reason, we briefly compare the tag ontologies with respect to their suitability for:

- (a) representing tagging activities and tagging data
- (b) representing features of folksonomies

We will compare seven conceptualisations, keeping in mind the folksonomy model (4) we proposed in Section 3.2. In particular, we include in our comparison a conceptualisation that we presented in our earlier work – the SCOT Ontology (Kim et al., 2008). The choice of the conceptualisations was based on how concrete the model is for tagging and use by online communities. Although a lot of work in analyzing folksonomies has been done in social theory and information retrieval, very few tag ontologies have been reported until today. Few

researchers have explicitly specified conceptualisations of tagging data (Borwankar, 2005; Story, 2007) in a formal language. Concerning our selection, at the time of this research only 6 of the 7 conceptualisations were actually proposed as ontologies and described in a dedicated representation language (e.g. OWL). Although Gruber's model is just defined conceptually, we include it in our comparison since many research papers have cited his model and some ontologies have been developed based on this model. The selection of ontologies we include in our comparison (plus Gruber's conceptualisation) is shown in Table 1. Some of the selected conceptualisations better suit the first criterion we have defined at the beginning of this section (a), whereas others are better suited to the second criterion (b). However, all conceptualisations are suitable for both criteria to varying degrees. We will now have a brief look at them individually.

TABLE 7: Features of tag ontologies. *\*Defined for use in this paper.*

| Ontology | URL                                                                                                         | Namespace | Format | Update    | Applications                                                                                                                                                            |
|----------|-------------------------------------------------------------------------------------------------------------|-----------|--------|-----------|-------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| Gruber   | -                                                                                                           | -         | -      | -         | -                                                                                                                                                                       |
| Newman   | <a href="http://www.holygoat.co.uk/projects/tags/">http://www.holygoat.co.uk/projects/tags/</a>             | *tags:    | OWL    | Nov 2005  | <a href="http://Reyvu.com">http://Reyvu.com</a>                                                                                                                         |
| Knerr    | <a href="http://code.google.com/p/tagont/">http://code.google.com/p/tagont/</a>                             | *tagont:  | OWL    | Jan 2007  | -                                                                                                                                                                       |
| Echarte  | <a href="http://eslomas.com/tagontology-1.owl">http://eslomas.com/tagontology-1.owl</a>                     | *ec:      | OWL    | 2007      | -                                                                                                                                                                       |
| SCOT     | <a href="http://scot-project.org">http://scot-project.org</a>                                               | scot:     | OWL    | June 2008 | <a href="http://int.ere.st">http://int.ere.st</a><br><a href="http://relaxseo.com">http://relaxseo.com</a><br><a href="http://openlinksw.com">http://openlinksw.com</a> |
| MOAT     | <a href="http://moat-project.org">http://moat-project.org</a>                                               | moat:     | OWL    | Feb 2008  | <a href="http://openlinksw.com">http://openlinksw.com</a><br>lord.info                                                                                                  |
| NAO      | <a href="http://www.semanticdesktop.org/ontologies/nao/">http://www.semanticdesktop.org/ontologies/nao/</a> | nao:      | NRL    | Aug 2007  | Nepomuk                                                                                                                                                                 |

Gruber's work is an early attempt to conceptualise tagging activities. His model can be viewed as a first step towards a general applicable representation model for tagging. Although his model itself is not an ontology it clearly reveals a generic conceptualisation of tagging. For more details on his work we refer to Gruber (2007, 2008). Newman's model (referred to as Newman) describes relationships between an agent, an arbitrary resource, and one or more tags. In this model there are three core concepts such as Tagger, Tagging, and Tag to represent a tagging activity. Knerr (2006) provides the tagging concept in the Tagging Ontology (referred to as Knerr) and Echarte et. al (2007) propose a model for folksonomies (referred to as Echarte). Since their approaches are based on the ideas of Gruber and Newman, the core elements of the ontologies are almost identical. In particular, Echarte's model extends concepts such as time, domain, visibility, type, etc., and is represented by OWL. The SCOT Ontology - Social semantic Cloud of Tags, describes the structure and semantics of tagging data and enables interoperability of tagging data among heterogeneous social websites and tagging applications. Although SCOT's main goal is to represent collaborative tagging activities, it is also suitable for representing the features of folksonomies (e.g. source, user group, frequencies, tag co-occurrence, etc.). MOAT (Passant, 2008) - Meaning of a Tag, is intended for semantic-annotation of content by providing a meaning for free-text tagging. In addition to extensions to the Tag, Tagging, and Tagger concepts from Newman's ontology, MOAT provides the Meaning class to represent custom, user-provided 'meanings' for tags. The Nepomuk Annotation Ontology (NAO) (Scerri et. al, 2007) is provided for annotating resources on the Social Semantic Desktop (<http://www.nepomuk.semanticdesktop.org/>). It is not entirely dedicated to tagging practices but demonstrates the increasing importance of tagging representation in social systems.

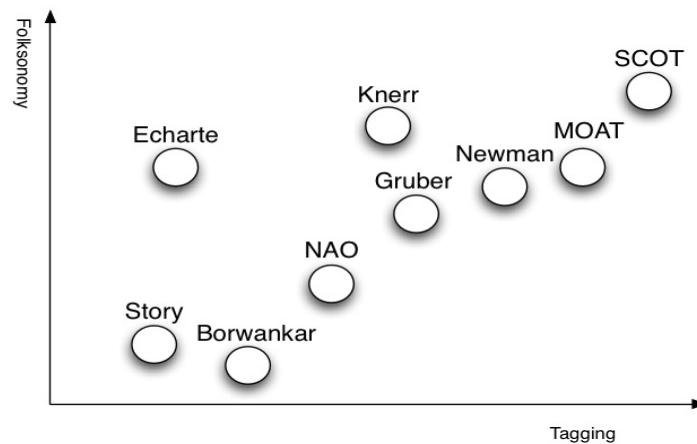


FIG. 4: Criterion suitability for different conceptualisations.

FIG. 4 demonstrates the different inclinations of the seven conceptualisations listed in Table 1, given the criteria discussed at the start of this section. Whereas Newman's Ontology is more inclined towards representing tagging data, and Echarte's Ontology towards representing features of folksonomies, SCOT has a higher level of sophistication in both directions. In the next section, we will detail the main entities and features that the six ontologies and Gruber's model are able to represent. We will support our conclusions in this section by exploring the suitability of the individual conceptualisations, vis-à-vis criteria (a) and (b) as set out in the start of this section. We start by listing and comparing the concepts (classes) and proceed by listing and comparing their features (attributes).

#### 4.1. Class Comparison

In this section we discuss in more details the general comparison we presented in the previous section. First, we will have a look whether the individual conceptualisations are suitable for representing general tagging activities and tagging data. All models have a representation for the *object*, *tag* and *tagger* in our Tagging model (5) and all except NAO have a concept representing the tagging process. In Newman's model, the tagging concept is further refined into *tags:RestrictedTagging* (exactly one tag for a resource) and *tags:Tagging* (one or more tags for a resource). Echarte et al. provide the *Annotation* class to represent the tagging activity – i.e., it is the same as *tags:Tagging*. Thus, the *Tagging* concept can be considered as a core concept of tag ontologies. Although SCOT and MOAT have different goals compared to others, they also can describe tagging by linking to the *tags:Tagging* class in Newman's ontology.

TABLE 8: Ontology concepts. Concepts are locally defined unless otherwise stated (e.g. *rdfs:Resource*).

| Model   | Resource             | Tag             | Tagging             | Tag Set          | User              | User Group            | Source                | Others                    |
|---------|----------------------|-----------------|---------------------|------------------|-------------------|-----------------------|-----------------------|---------------------------|
| Gruber  | <i>Object</i>        | <i>Tag</i>      | <i>Tagging</i>      |                  | <i>Tagger</i>     |                       | <i>Source</i>         | <i>Polarity</i>           |
| Newman  | <i>rdfs:Resource</i> | <i>:Tag</i>     | <i>:Tagging</i>     |                  | <i>foaf:Agent</i> |                       |                       | <i>:RestrictedTagging</i> |
| Knerr   | <i>rdfs:Resource</i> | <i>:Tag</i>     | <i>:Tagging</i>     |                  | <i>:Tagger</i>    | <i>foaf:Group</i>     | <i>:ServiceDomain</i> | <i>:VisibilityEnum</i>    |
| Echarte | <i>:Resource</i>     | <i>:Tag</i>     | <i>:Annotation</i>  |                  | <i>:User</i>      |                       | <i>:Source</i>        | <i>:Polarity</i>          |
| SCOT    | <i>sioc:Item</i>     | <i>:Tag</i>     | <i>tags:Tagging</i> | <i>:TagCloud</i> | <i>sioc:User</i>  | <i>sioc:Usergroup</i> | <i>sioc:Site</i>      | <i>:Cooccurrence</i>      |
| MOAT    | <i>rdfs:Resource</i> | <i>tags:Tag</i> | <i>tags:Tagging</i> |                  | <i>foaf:Agent</i> |                       |                       | <i>:Meaning</i>           |
| NAO     | <i>rdfs:Resource</i> | <i>:Tag</i>     |                     |                  | <i>:Party</i>     |                       |                       |                           |

We now consider whether the ontologies address collective tagging data and provide sufficient features of folksonomies, as described in our Folksonomy model (5). Some ontologies which are based on Gruber's model (which was not designed for folksonomies) have been extended in order to support folksonomies. For instance, Knerr and Echarte introduce the *ServiceDomain* and the

*Source* class to represent the *source*. In addition, Knerr allows a user to use *foaf:Group* alongside *foaf:Person* to describe the *user group*. Similarly, NAO allows the user to use *nao:Party* to represent the *user group*. MOAT does not have a class for defining it. Nevertheless they are not enough to represent folksonomies at a semantic level. SCOT is consistent with the folksonomy model and provides representations for the *source*, *user group* and *tag set*. In Table 2 we compare the classes provided by these conceptualisations that are relevant to our study. Additionally, we must note that although an ontology might not provide all the required representations, they can act as a “good Semantic Web citizen” by connecting to external vocabularies such as SIOC (Semantically-Interlinked Online Community), FOAF (Friend-of-a-Friend), SKOS (Simple Knowledge Organisation System), or DC (Dublin Core Metadata) to further weave data on the Web. For example, MOAT and SCOT use the SIOC ontology extensively to describe online communities, while other ontologies do not reuse or link to external terms. In particular, although Echarte has its own classes to represent a tagging and a folksonomy, the classes do not have any relations with other RDF vocabularies.

TABLE 3: Data type properties. The table shows value attributes for some core concepts, interpreted as domain (row) – property – range (column).

|          | Literal                                                                                                                                                                                               | Time                                                 | Numeric Values                                                                                                     |
|----------|-------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|------------------------------------------------------|--------------------------------------------------------------------------------------------------------------------|
| Source   | tagont:hasServiceName                                                                                                                                                                                 |                                                      |                                                                                                                    |
| Resource | ec:hasURI<br>ec:hasSourceName                                                                                                                                                                         |                                                      |                                                                                                                    |
| User     | ec:hasUserName                                                                                                                                                                                        |                                                      |                                                                                                                    |
| Tag Set  | dc:title<br>dc:description                                                                                                                                                                            | scot:updated                                         | scot:totalTags<br>scot:totalTagFrequency<br>scot:totalItems<br>scot:totalCooccurTags<br>scot:totalCooccurFrequency |
| Tag      | tags:name<br>tags:tagName<br>tagont:prefTagLabel<br>tagont:hasTagLabel<br>nao:prefSymbol<br>nao:prefLabel<br>nao:description<br>ec:hasPrefLabel<br>ec:hasLabel<br>ec:hasAltLabel<br>ec:hasHiddenLabel | scot:lastUsed<br>nao:created<br>nao:lastModified     | scot:ownAFrequency<br>scot:ownRFrequency<br>scot:cooccurAFrequency<br>scot:cooccurRFrequency<br>ec:hasPosition     |
| Tagging  | tagont:hasNote                                                                                                                                                                                        | tags:taggedOn<br>tagont:isTaggedOn<br>ec:hasDateTime |                                                                                                                    |

## 4.2. Attribute Comparison

While the number of classes enhances taxonomical representations, the power of ontologies lies in the ability of representing relationships between the classes. Although most of the studied ontologies have a similar taxonomical structure, their attributes vary according to their goals and purposes. We will now have a look at the attributes provided by the ontologies, and compare their functionalities. We differ between data type attributes, which relate classes to non-conceptual data (e.g., string or date), and object type properties which provide relationships between classes.

**Data Type.** Aside from declarative features that represent relationships among users, tags, and resources, a semantic model for folksonomies needs to provide for descriptive features that state non-conceptual values. Most surveyed tag ontologies have many attributes to describe data-type values, i.e. numerical quantities, free-text descriptions, date, time, etc. The data-type properties relevant to this work are summarised in Table 9. A number of datatype properties are either directly or indirectly (i.e. via *subPropertyOf*) reused from the Dublin Core vocabulary. For instance Newman’s ontology *tags:name* is a subproperty of *dc:title* and *tags:taggedOn* is a

subproperty of *dc:date*. Only SCOT provides for the description of numerical values for entities, e.g. *scot:totalTags* (attributed to a *scot:TagCloud*) refers to the total number of tags in a tag cloud and *scot:totalItems* refers to the total number of resources tagged with tags in the tag cloud. SCOT also provides properties relating to the frequency of a tag itself. Whereas the simplistic *scot:ownAFrequency* refers to the actual occurrence(s) of a particular tag in a tag cloud, *scot:ownRFrequency* represents the percentage frequency of a tag within a particular tag cloud, relative to the total of all tag frequencies in that tag cloud.

There are many attributes to describe string and literal values for a specific purpose, e.g. *tags:name*, *tagont:prefTagLabel*, *nao:preLabel*, and *ec:hasLabel* for describing tag's name.

Table 4: Object type properties. The table shows relationships between core concepts, interpreted as domain (row) – property – range (column).

|            | Source                                      | Resource                                                                             | User Group        | User                                            | Tag Set          | Tag                                                                                                                                  | Tagging              | Others                                                                    |
|------------|---------------------------------------------|--------------------------------------------------------------------------------------|-------------------|-------------------------------------------------|------------------|--------------------------------------------------------------------------------------------------------------------------------------|----------------------|---------------------------------------------------------------------------|
| Source     |                                             |                                                                                      |                   |                                                 |                  |                                                                                                                                      |                      | tagont:<br>hasServiceHomepage<br>ec:hasSource                             |
| Resource   |                                             |                                                                                      |                   |                                                 |                  | tags:taggedWithTag<br>scot:hasTag<br>nao:hasTag                                                                                      | tags:tag             |                                                                           |
| User Group |                                             |                                                                                      |                   |                                                 |                  |                                                                                                                                      | tagont:hasTagging    |                                                                           |
| User       |                                             |                                                                                      |                   |                                                 |                  |                                                                                                                                      | tagont:hasTagging    |                                                                           |
| Tag Set    | scot:tagSpace                               |                                                                                      | scot:hasUsergroup | scot:createdBy                                  | scot:composedOf  | scot:contains                                                                                                                        | scot:taggingActivity |                                                                           |
| Tag        |                                             | tags:isTagOf<br>scot:tagOf<br>nao:isTagFor<br>ec:hasRelatedResource                  |                   | scot:usedBy<br>nao:creator                      | scot:containedIn | tags:equivalentTag<br>tags:relatedTag<br>scot:aggregatedTag<br>scot:spellingVariant<br>scot:delimited<br>tagont:sameTag<br>ec:hasTag |                      | moat:hasMeaning<br>ec:hasPolarity<br>scot:cooccursIn<br>scot:cooccursWith |
| Tagging    | tagont:<br>hasServiceDomain<br>ec:hasSource | tags:taggedResource<br>tagont:hasTaggedResource<br>ec:hasResource<br>moat:tagMeaning |                   | tags:taggedBy<br>tagont:hasTagger<br>ec:hasUser |                  | tags:associatedTag<br>tagont:hasTag<br>ec:hasAnnotationTag                                                                           |                      | tagont:hasType<br>tagont:hasVisibility                                    |

**Object Type.** The object type properties relevant in the context of this study are summarised in Table 4. SCOT, Echarte and Knerr provide the possibility to define a tagging activity. In SCOT, there is no local property to describe who is involved in a tagging activity. For this purpose SCOT reuses Newman's *tags:taggedBy* attribute. Via SCOT one can describe who uses tags via the *scot:usedBy* property. Meanwhile, three ontologies have the property to identify a location or source in which the tagging occurred. TagOnt provides *tagont:hasServiceDomain* to link the tagging activity to the *ServiceDomain*, Echarte provides *ec:hasSource* with the *Source* as its range value, whereas SCOT provides *scot:tagSpace* with a range of *sioc:Site*. The relation between tags and resources is defined via *tags:isTagOf* (range: *rdfs:Resource*), *nao:isTagFor* (range: *rdfs:Resource*), and *scot:tagOf* (range: *sioc:Item*) properties in the Newman, NAO and SCOT ontologies respectively. They also provide inverse properties for this relation. Defining relations between tags is one of the benefits of using an ontology to model folksonomies, since this effectively gives semantics to tags in a tag set. Nevertheless only SCOT and Newman take advantage of this possibility. Whereas Neman provides very restricted properties such as *tags:equivalentTag* and *tags:relatedTag*, SCOT provides many more attributes such as *scot:spellingVariant* and *scot:delimited*. The spelling variant property is further refined into *scot:acronym*, *scot:plural*, *scot:singular* and *scot:synonym*. In addition, the latter has further subproperties to define specific synonym types, i.e. *scot:hyphenated*, *scot:underscored*, *scot:slashed*, and *scot:spaced*. In comparison to other ontologies, SCOT specifically provides attributes that represent characteristics of folksonomies such as *scot:hasUsergroup*, *scot:createdBy*, *scot:contains*, and *scot:taggingActivity*.

To conclude this section we briefly give a summary of the comparison. So far, tag ontologies have mainly been used for representing tagging activities, and only to a minor extent for modeling the features of folksonomies. According to the Folksonomy model given in Section 3.2,

SCOT is suitable for this model. But, we might argue that the surveyed ontologies have different ontological purposes and different expressivity. Therefore, as an ideal solution we might need to interlink among the proposed ontologies.

## 5. Conclusion

In the first half of this paper we proposed a model for collaborative tagging activities and folksonomies – based on the widely accepted model for tagging. The detailed comparisons presented in Section 4 support several general concluding observations about ontologies related to tagging activities and their usefulness in collaborative tagging systems. This research can be considered as a first attempt to systematically compare different conceptualisations of semantic tagging for collaborative tagging systems. We believe that tag ontologies should be evaluated with respect to a particular goal, application or scenario rather than merely for the sake of an evaluation. Our observations take into consideration two separate criteria – the depth of tagging data per se, and the collaborative aspect in folksonomies. As we mentioned in the start of the paper, tag ontologies are in an early stage and current approaches need to be elaborated or combined to enrich schemas and meet both criteria. Nevertheless the surveyed ontologies already offer an improved opportunity for collaborative tagging systems – especially given the machine-processable representations that they can provide.

Following the comparison of the tag ontologies we arrived at the following conclusions:

- There is agreement on the issue as to what are the most elementary building blocks of a model for the tagging. The building blocks consist of the taggers, the tags themselves, and the resources being tagged.
- Different individuals create substantially different conceptualisations of tagging data and tagging activities despite the fact that their purposes are similar.
- The tag model does not cover overall characteristics of a folksonomy. SCOT, combined Gruber's conceptual model and Newman's vocabularies, is the ontology that must be suitable to represent collaborative tagging activities and it provides the most appropriate representations for the Folksonomy model as we defined it. In addition linking between SCOT and MOAT is useful way to complement to define a meaning of tag.

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