

Developing a multilayer semantic annotation scheme based on ISO standards for the visualization of a newswire corpus

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Abstract

In this paper, we describe the process of developing a multilayer semantic annotation scheme designed for extracting information from a European Portuguese corpus of news articles, at three levels, temporal, referential and semantic role labelling. The novelty of this scheme is the harmonization of parts 1, 4 and 9 of the ISO 24617 *Language resource management - Semantic annotation framework*. This annotation framework includes a set of entity structures (participants, events, times) and a set of links (temporal, aspectual, subordination, objectal and semantic roles) with several tags and attribute values that ensure adequate semantic and visual representations of news stories.

1 Introduction

The development of an annotation framework can be an overwhelming task, even more when its purpose is to account for different linguistic phenomena. However, as challenging as it may be, designing an annotation scheme is an indispensable step to generate language resources that can be the starting point of fundamental corpus-based linguistic research.

When deciding on an annotation framework, one has to take into consideration several factors (Pustejovsky et al., 2017), such as main objectives of the annotation, the linguistic phenomena under analysis, the corpus genre, and the nature of the annotation, and weigh in the advantages and

disadvantages of adapting/ adopting an existing model, or of creating one. Ideally, the model is custom designed to deal with all the specificities of a particular project, but also broad enough so that it can be applied to other datasets. In fact, with the growth of the Semantic Web and Linguistic Linked Data (Chiaros et al., 2020), interoperability is key to read and to interpret linguistic resources (Ide and Pustejovsky, 2010).

With all the above-mentioned provisos in mind, we developed a multilayer semantic annotation scheme by combining three standards from the *Language resource management-Semantic annotation framework: Part 1- Time and events (ISO-24617-1)*, *Part 4- Semantic roles (ISO-24617-4)* and *Part 9- Referential annotation framework (ISO-24617-9)*. In addition to promoting interoperability, our model has proven to be able to markup manually the relevant features of the genre news to generate visual representations of their narratives. Moreover, our proposal operationalizes the integration of three different standards in the same framework, which is, to the best of our knowledge, a novelty.

This multilayer semantic annotation scheme was designed to annotate a European Portuguese corpus of news articles in three different, but complementary, levels, temporal, referential and thematic, within the Text2Story project¹, which aims to extract narratives from news, represent them in intermediate data structures, and make these available to subsequent media production processes, i.e., visualizations such as message sequence charts (MSC) and knowledge graphs (KG). In this paper, we document the decision-

¹ <https://text2story.inesctec.pt/>

making process about which annotation format to adopt, what adjustments to make, and how to harmonize the three layers into an integrated and wide-ranging model.

2 Background and Motivation

News may frequently assume the format of a story that reports on current events involving one or more entities in given time and place. In addition to the main event, however, news stories typically present contextual content that allows connecting it to others, explaining the circumstances and consequences of its occurrence. It may also include other complementary information that frames, comments, clarifies, or evaluates the reported events (Caswell and Dörr, 2019; Choubey et al., 2020; cf. also van Dijk, 1985; Bell, 1991). A complete story usually answers six questions: what, who, where, when, why, and how, that is, 5W1H (a.o. Bonet-Jover et al., 2021), following a top-down organization, corresponding to an inverted pyramid discourse structure (cf. Rabe 2008), in which information flows in decreasing order of importance. A news organization structure usually features a title, a lead, and the body. In many cases, the lead or introductory paragraph condenses the answers to the above six questions and is followed by complementary information (a.o. Thomson et al., 2008; Norambuena et al., 2020). Sometimes, the answer to some of the questions is distributed throughout the text (Bonet-Jover et al., 2021). Because of this organization, events frequently follow a non-chronological order, presenting a complex time structure regarding other kinds of narratives (Zahid et al., 2019). Besides, the narrative may return to previous data, as well as adding information (a.o. van Dijk, 1985; Thomson et al., 2008; Choubey et al., 2020).

Establishing the temporal sequencing of events, their participants, and interrelations is crucial to understand the news story, and ultimately to extract the narratives to be represented graphically by means of MSC (Harel and Thiagarajan, 2003) or KG (Ehrlinger and Wöß, 2016), which is our project’s main objective. These visualizations by portraying the narratives more schematically can be of great interest to news agencies, for example. The more overarching and rigorous the annotation the more informative is the visualization, and, in

the case of news articles, this requires featuring participants, events and times, as well the relationships between them. For these reasons, the annotation scheme that we designed encompasses three intertwined semantic layers: temporal, referential and thematic. Since our aim was to adopt a coherent and interoperable annotation scheme with these three layers, and because none of the existing proposals satisfied these requisites, we designed an annotation scheme which compatibilizes three ISO.

3 Related work

Over the last years, there has been a proliferation of multilayer corpora, that is, corpora that “contain mutually independent forms of information, which cannot be derived from one another reliably” (Zeldes, 2019: 4). These layers can be defined in an independent way and they “are explicitly analyzed using multiple, independent annotation schemes” (Zeldes, 2019: 7), or resorting to one unique scheme that integrates all the layers. In fact, an in-depth analysis of the relevant literature reveals that there are many different types of multilayer annotation schemes. In the remainder of this section, we will only present a brief overview of some of those proposals.

One of the most well accomplished and far-reaching multilayer annotation schemes is the one developed within the *Groningen Meaning Bank* (GMB) (Basile et al., 2012; Bos et al., 2017). Besides morphological and syntactic annotation, it comprises different semantic annotation levels, such as named entity recognition, temporal features, and thematic roles. The adopted semantic formalism is an extension of *Discourse Representation Theory* (Kamp and Reyle, 1993), which renders a semantic representation (*discourse representation structures*) that unifies the various layers. Another important feature of this scheme is that it was designed to analyze linguistic phenomena in texts, instead of only sentences, and it has been used quite successfully in 10,000 texts from different genres, namely news and fables. Its implementation requires a human-aided machine annotation insofar as it employs NLP software such as an automatic tagger for named entity recognition, VerbNet (Schuler, 2005) for semantic role labelling, a semantic analyzer for coreference, and then a module Boxer (Bos, 2005, 2008; Curran

et al. 2007), responsible for the overall semantic analysis, but also relies on the input of experts and general public. Although, in terms of semantic annotation, it is one of the most complete, this scheme lacks information about more referential relations. Moreover, since the temporal annotation is based on DRT-language, it does not integrate tags about lexical and contextual meaning with bearing on temporal interpretation, namely a more diversified class of events, and other link types between events.

Other multilayer annotation schemes have been developed for *Manually Annotated Sub-Corpus* (MASC) (Ide et al., 2008), *Georgetown University Multilayer Corpus* (GUM) (Zeldes and Simonson, 2016; Zeldes, 2017), *OntoNotes* (Hovy et al., 2006), for *AMALGUM* (Gessler et al., 2020), or *SenSem* (Fernández and Vázquez, 2014), just to name a few, but none of those provide a comprehensive and harmonized semantic framework suitable to handle the linguistic phenomena that we need to address.

For European Portuguese (EP), one can point out the scheme used in CINTIL DeepBank (Branco et al., 2010), which is a corpus of Portuguese news and novels that is annotated with several grammatical information (morphological, syntactic, and semantic) for each sentence. Currently, there are 32497 sentences, mainly from news, which were semi-automatically annotated with Treebank, DependencyBank, Propbank, and LogicalFormBank (with formal representations of the sentences meanings using Minimal Recursion Semantics). However, the CINTIL DeepBank’s scheme does not include a level for referential annotation, nor for temporal annotation. The fact that only the sentences that the grammar can parse are included in the corpus is a downside. Additionally, though each level of annotation can be accessed separately, a unifying formalism that combines all the layers is missing.

Regarding schemes aimed exclusively at semantic annotation, some are intended to handle a specific phenomenon, resort to non-standardized markup language, and are not widely known (cf. for an overview (Gries and Berez, 2017). Moreover, the majority deals with lexical problems, such as word disambiguation, and less with compositional semantics. The scarcity of proposals within this branch of semantics can be explained by the complexity underlying the process

of annotating semantically data at a sentential and textual level. This task requires not only a great amount of time, but also a wide variety and substantial number of resources. Nonetheless, semantic schemes to represent the meaning of texts are of utmost relevance to the development of different applications.

4 The Annotation scheme

4.1 The process

Building a bootstrapping annotation scheme is a very complex and time-consuming endeavor involving different phases. After the literature review, we started by defining the tags and their attributes first for the temporal layer, then for the referential level, and finally for the semantic role labelling. To create a model, we followed the MATTER (Pustejovsky and Stubs, 2012) sub-cycle, MAMA, with four steps, (1) model, (2) annotate, (3) evaluate and (4) revise. This process allowed us to identify and resolve the scheme’s inconsistencies, gaps and incompatibilities, and to gradually improve it so that it could properly account for the linguistic data, and to deliver the necessary input for the visualization task. This cycle was repeated several times until we were satisfied with the model. The annotation tool that we used, BRAT (brat rapid annotation tool) (Stenetorp et al., 2012), enabled the updates of the annotation scheme without having to rebuild the whole scheme.

4.1.1 Temporal Layer

Temporal interpretation plays a crucial part in understanding how the events are organized in natural language texts. For this reason, extraction of temporal information has been receiving a lot of attention within NLP during the past few years. One approach to extract temporal features, and eventually to rebuild chronological sequences of events, is designing a suitable annotation scheme. In this field, research has started with the extraction of time expressions in message understanding conferences (MUCs) and progressed to relating events to times (eg. Filatova and Hovy, 2001; Katz and Arosio, 2001; Song et al., 2016). From the growing investment on temporal extraction, on the one hand, and from its usefulness, on the other hand, ensued not only a significant number of corpora annotated according to different schemes,

but also annotation standards. One of these standards is TimeML (Pustejovsky et al., 2003a, 2003b), based on the work of Setzer (2001), Setzer & Gaizauskas (2000a, 2000b, 2001) and Ferro et al. (2003), from which ISO-TimeML (ISO 24617-1) stemmed.

ISO-TimeML, a model grounded on linguistic approaches (eg. Reichenbach, 1947; Comrie, 1985), defines a full-fledged markup language that permits a fine-grained annotation of time expressions, events, and temporal relations between events and between events and time expressions. Its efficacy and productivity in capturing the text’s temporal structure is evidenced by corpora such as TIDES Temporal Corpus (Gerber et al., 2002), TimeBank (Pustejovsky et al., 2003b), composed of news articles, or Sun et al. (2013)’s corpus with clinical narratives. Costa (2012) and Costa and Branco (2010, 2012) use TimeML to annotate for the first time a EP corpus with temporal information, TimeBankPT. This corpus, nonetheless, only comprises the translations of texts from the original TimeBank, as well as the same annotations with some adaptations required by language specificities.

Compared to the scheme employed by TimeBankPT, the temporal tagset and linkset that we subscribe follow more closely ISO-24617-1. As expected, bearing in mind the project’s main aim, that is, visualization of news narratives, and the necessity of not overloading the scheme with unnecessary information, some tags and links were excluded. Thus, for the temporal layer, our scheme incorporates two tags, event and times, and three links, temporal link (TLink), aspectual link (ALink) and subordination link (SLink).

The tag event marks eventualities (Bach, 1985), represented by tensed or untensed verbs, nominalizations, adjectives, predicative constructions or prepositional complements. The combination of all the required attributes, class, part of speech, tense, aspect, verb form, mood, modality and polarity, provides the necessary information about temporal, aspectual and modal features of events. With respect to the values for each attribute, we maintained the ones established by ISO-24617-1, namely for Italian, but added in the attribute mood the value *future* to account for its modal uses, and the modality values *dever* (‘must’), *poder* (‘can’), *ter de* (‘have to’) and *ser capaz de* (‘be able to’).

Regarding the tag times, we adopted a very simple scheme, which meets the needs of our project. The attributes that incorporate our annotation scheme are the required ones, according to ISO-24617-1, that is, type (date, time, duration and set) and value (the specific value of the type). We have also integrated two optional attributes: temporal function with the value publication time and anchor time, which are pertinent to process time expressions common in news articles, like *hoje* ‘today’, *na sexta-feira* ‘Friday’.

The sequencing of the events, that is, their ordering, is essential to depict the way the narrative evolves in time. ISO-24617-1 specifies the adequate manner to establish the events timeline, as well as the relations between events and time expressions by postulating TLinks, which we integrated in our scheme. In turn, the ALink, by specifying the relation between aspectual verbs and their event arguments, gives crucial input to create the visualizations of the events. The relevance of the SLink derives from the fact that the news articles frequently include contexts of subordinating relationships between events. We omitted the measuring link (MLink) because the information it conveys is already captured to a certain extent by the value duration for the attribute type of tag times. The values for the three links of our model are the ones proposed by ISO-24617-1.

4.1.2 Referential Layer

Pointing out to the referring expressions in a text, identifying the discourse entities denoted by those expressions, and establishing the links between them are key tasks to reference annotation, and underly referential phenomena in discourse, such as anaphora.

In our corpus, those referring expressions correspond to named entities, or participants that play an important role in the story. Therefore, we needed a framework to deal with named entities recognition and their relation throughout the news texts. ISO-24617-9 met these needs, as it is a meta-model of referential annotation that articulates the discourse domain with the linguistic domain, contributing to a comprehensive representation of the discourse entities, the referring expressions that denote them, and their relations.

Despite following the standard in its overall guidelines, we did not annotate all its categories, and both discourse entity structures and referential

expression structures were kept as simple as possible, to avoid overloading the process of annotation: the former include only information concerning the lexical head (noun, pronoun), whereas the latter include information concerning domain (individuation and types) and involvement. The individuation attribute, with the values set, individual and mass, follows ISO-24617-9 definitions, while for involvement we defined the values: 0 (the empty set); 1 (a set with only one entity); >1 (a set with more than one entity, but less than the totality of entities in the domain); *all* (the totality of entities in the domain = universal quantification); *undef* (undefined involvement).

As for types, since ISO 24617-9 does not provide a typology of named entities, we selected, considering our corpus text genre and the purpose of the project, a tagset of six named entities: PER, ORG, LOC, OBJ, NAT, OTHER. In fact, the definition of named entities is neither easy nor consensual, and there are several typologies for their classification, being the number and types of entities influenced by factors, such as the domain from which they are extracted or the purpose of its classification (for a survey on this topic, see, a.o. Nouvel et al., 2016; Goyal et al., 2018). This tagset is an adaptation of general categories depicted in the named entity classification typologies used in many other corpora, including multilayer ones. The first three named entities are common to all the annotated corpora while the others may vary.

In what concerns the relations included in ISO-24617-9, we did not include in our specifications the lexical relational links between entity structures and referring expressions (eg. synonym, antonym, hyponym, meronym), the referential status of referring expressions (old/new), and the properties of discourse entities (abstractness, animacy, alienability, natural gender and cardinality), because they were not necessary for the visual representations of news. As a matter of fact, it is more useful for visualization to mark two linguistic expressions as referring to the same participant. Thus, our analysis only considers the proposed objectal links (objectalIdentity, partOf, subset, memberOf and referentialDisjunction) between discourse entities, which allows to represent

nominal anaphora's mechanisms. Unlike many studies that focus on anaphora resolution and depict only coreferential mechanisms, leaving out other types of relations, the adopted framework allows for the marking of different types of anaphoric linkage between entities, namely direct and indirect anaphora.²

4.1.3 Semantic Role Layer

The task of semantic role labelling for English texts usually uses one of the following frameworks (see also ISO 24617-4, Annex B): FrameNet (Baker et al., 1998), VerbNet (Schuler, 2005), PropBank (Palmer et al., 2005), EngVallex (Cinková, 2006), and LIRICS (Petukhova and Bunt, 2008).

As for EP data, there are some proposals that approach the issue of semantic role labelling, typically using the methodology of PropBank and VerbNet. However, these proposals have a very narrow scope, working with small datasets and small lists of (typically) verbs. Some examples of these works are PropBankPT (Branco et al., 2012), a corpus of 3406 sentences translated from the *Wall Street Journal*, and annotated with information concerning constituency structure (phrase constituency and grammatical relations) and semantic roles; and CINTIL-PropBank (Branco et al., 2012), a corpus of 10039 sentences extracted from news and novels, and annotated with information concerning constituency structure and semantic roles. There is also ViPer (Talhadas et al., 2013), a verbal lexical database with information about the verb's arguments semantic roles (using PropBank approach) manually annotated. However, there are some aspects of the semantic roles list that is used that can be problematic for our project (for instance, event-denoting nouns are treated as arguments of the "occurrence" type, instead of being treated as events, like in ISO-24617-1).

So, the semantic role labelling task in our project could not be based on previous work done for EP, and it had to be done from scratch. The easier way to do so was to use some established framework and adapt it to EP, but the methodology typically used in frameworks designed for English (eg. FrameNet) requires that, for each verb, a frame be

² The Universal Anaphora initiative (<https://universalanaphora.github.io/UniversalAnaphora/>) has been working towards a proposal markup scheme

compatible with Universal Dependencies, and that codifies different aspects of the anaphoric phenomena.

constructed, and the construction of each frame entails many examples with the same verb and their analysis (to identify all the meanings the verb can have and all the constructions in which it can occur), to determine its semantic selection. This work would be colossal, and impracticable taking into account the time frame and objectives of the project. Therefore, we needed a framework that would allow semantic annotation to be limited to the analysis of concrete examples of the news to be annotated. We started working with the framework provided by LIRICS, which was the most appropriate for the task. Furthermore, as LIRICS was the basis for the construction of the ISO standard for thematic annotation, there would be fewer potential problems when integrating semantic role annotation with referential and temporal annotation.

Consequently, in our project, we annotate semantic roles following ISO-24617-4 specifications in what concerns semantic roles. We do not construct entity structures, nor event structures in this level of annotation. Instead, we use the entity structures constructed in the referential annotation to deal with non-event discourse entities, and the entity structures constructed in the temporal annotation to deal with event discourse entities. The semantic role annotation consists in establishing the thematic relation between predicates and their arguments and modifiers.

4.2 Harmonizing Different Layers

The foregoing describes how the markup language used in each layer of our annotation scheme was extracted from three different standards. Although they comply with the principles for semantic annotation (ISO-24617-6), in fact, they were elaborated separately and asynchronously, and they lack information about how to combine them with each other. ISO-24617-6, in addition to defining some overall guidelines for the semantic annotation framework (SemAF), attempts at tackling some overlaps and inconsistencies between the different parts of the SemAF, but its coverage is limited. This means that, when combining different parts of the SemAF, as we did, it is expected that not only some incompatibilities may arise, but also some loose-ends and gaps may be left unsolved. Proposals such as Bunt (2019) improve the absence of some information in one

particular part of SemAF by resorting to some notations from other parts of the ISO. Gaizauskas and Alrashid (2019), for instance, put forward a scheme with some annotations from ISO-24617-1/7, but do not refer to issues related to incompatibilities. Therefore, in the process of constructing our model, we had to overcome these difficulties in order to obtain a fully integrated scheme.

We began by modelling the types of structures as entity structures and link structures, and defined subtypes for each type, as described in Figure 1.

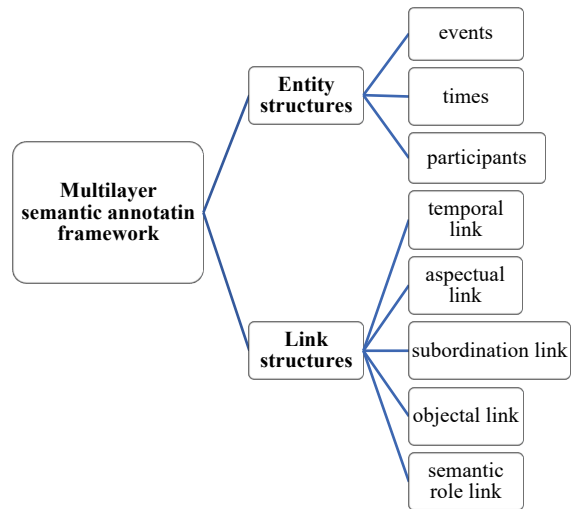


Figure 1: Text2story semantic annotation framework

This annotation structure is the first step to guarantee that all the layers are combined into a coherent annotation scheme. The entity structures, regardless of the layer to which they are associated, are available to be related among them by different types of link structures. Such unifying approach facilitates a uniform semantic representation in discourse representation structures (DRS).

The next step was to decide on the attributes and their respective values, so the information they codified would be compatible and not repetitive, as explained in the previous sections. The final annotation scheme is presented in Table 1.

ENTITY STRUCTURES		
EVENTS	class	occurrence, state, reporting, perception, aspectual, I-action, I-state
	type	state, process, transition
	pos	verb, noun, adjective, preposition
	tense	present, past, future, imperfect, none
	aspect	progressive, perfective, imperfective, imperfective-progressive, perfective-progressive, none
	vform	none, gerundive, infinitive, participle
	mood	none, subjunctive, conditional, future, imperative
	modality	<i>dever, poder, ter de, ser capaz de</i>
	polarity	negative, positive
TIME	type	date, time, duration, set
	value	specific value
	temporal function	publication_time
	anchortime	time ID (select relevant time)
PARTICIPANTS	lexical head	noun, pronoun
	domain	individuation: set, individual, mass types: per, org, loc, obj, nat, other
	involvement	0,1, >1, all, undefined
LINK STRUCTURES		
Temporal links		before, after, includes, is_included, during, simultaneous, identity, begins, ends, begun_by, ended by
Aspectual links		initiates, culminates, terminates, continues, reinitiates
Subordination links		intensional, evidential, neg_evidential, factive, counter_factive, conditional
Objectal links		objectalIdentity, partof, subset, memberOf, referentialDisjunction
Semantic role links		agent, source, location, path, goal, time, theme, instrument, partner, patient, pivot, cause, beneficiary, result, reason, purpose, manner, medium, means, setting, initialLocation, finalLocation, distance, amount, attribute

Table 1: Text2story annotation scheme

The harmonization of the different annotation layers using ISO-standards presented us with some mismatches between the three ISOs, which had to be addressed and solved. As an illustration, we present two of those issues.

Concerning markables, while the thematic annotation specifications in ISO 24617-4 foretold that a clause may receive a semantic role, the referential ISO does not stipulate any entity structure for clauses. Our solution to this problem was to mark the event structure corresponding to the verbal predicate of the subordinated clause so that the semantic role link can be set up. Accordingly, in a sentence like *John said that Mary went to Porto* the chunk that is linked to “said” by the semantic role theme is not the whole clause, but only the verb “went”, because it has been already associated to an entity structure, more precisely to an event structure, in the temporal layer, contrary to the clause. This solution adopts a Neo-Davidsonian perspective of the relation between events and their arguments and considers that all entities with an event structure annotated in the temporal level correspond to an event argument of a predicate. So, in a Neo-Davidsonian version, the sentence above would have the following logical form: $\exists e^1 [\text{SAY}(e^1) \ \& \ \text{AGENT}(e^1, \text{John}) \ \& \ \exists e^2 [\text{GO}(\exists e^2) \ \& \ \text{AGENT}(\exists e^2, \text{Mary}) \ \& \ \text{TO}(\exists e^2, \text{Porto}) \ \& \ \text{THEME}(e^1, e^2)]]$.

However, some problems are of more difficult resolution. ISO-24617-4 envisages that some adverbial phrases may be attributed the semantic role of manner, like “tightly” in the sentence *The tiny stick was fastened tightly to his wrist* (ISO-24617: 23). Nonetheless, “tightly” in our framework (and in the relevant ISO-standards, for that matter) cannot be marked as any kind of entity structure. We could simply disregard it because it is a modifier, but in some cases manner adverbial phrases are complements (*The child behaved badly*), conveying pertinent information to the story, and, hence, they should be annotated. At this moment, we still have no means to come to grips with this conundrum.

Despite the above-mentioned hurdles, we have been able to conciliate three ISO-standards and produce a consistent and complete multilayer semantic annotation scheme, which not only adequately serves the purpose of our project, but may also contribute to other annotations’ schemes.

5 An Annotated Example

In our model, the annotation procedure consists of three stages. Example (1) will serve to illustrate the three stages.

(1) 20/03/2021

Cientistas que estudavam a erupção de um vulcão da Islândia decidiram esta sexta-feira usar a lava expelida da cratera para assar salsichas.

Scientists that were studying the eruption of a volcano of Iceland decided this Friday to use the lava expelled from the crater to roast sausages.

In the first stage, the annotator marks the entity structures of events and times, and, then, the temporal, aspectual and subordination links are established.

EVENTS

e1=*estudavam* class=occurrence type=process pos=verb tense=past aspect=imperfective polarity=pos vform=none mood=none

e2=*erupção* class=occurrence type=process pos=noun tense= none aspect= none polarity= pos vform=none mood=none

e3=*decidiram* class=occurrence type=transition pos=verb tense= past aspect=perfective polarity= pos vform= none mood= none

e4=*usar* class=occurrence type= process pos=verb tense=none aspect=none polarity=pos vform=infinitive mood= none

e5=*expelida* class=occurrence type=transition pos=verb tense=past aspect= perfective polarity= pos vform=participle mood=none

e6=*assar* class=occurrence type=process pos=verb tense=none aspect=none polarity=pos vform= infinitive mood=none

TIME EXPRESSIONS

t1=*20/03/2021* type=date value=20-03-2021
FunctionInDocument= publication time

t2=*esta sexta-feira* type=date value=19-03-2021
AnchorTimeID=t1

TLINK

e2 before e1

e3 is_included e1

e3 is_included t1

e4 after e3

e5 before e3

e6 simultaneous e4

SLINK

e4 intensional e3

e6 intensional e4

In the second stage, the participants are identified, and they are related to each other by objectal links.

PARTICIPANTS

p1=*cientistas que estudavam a erupção de um vulcão na Islândia* lexical head=noun individuation=individual type =per involvement=>1

p2=*que* head=pronoun individuation=individual type =per involvement=>1

p3=*um vulcão da Islândia* head=noun individuation=individual type =per involvement=1

p4=*a lava expelida da cratera* head=noun individuation= mass type =nat involvement=1

p5=*a lava* head=noun individuation=mass type=nat involvement= undef

p6=*a cratera* head=noun individuation= individual type =nat involvement=1

p7=*salsichas* head=noun individuation= individual type =obj involvement=>1

OBJECTAL LINKS

p2 ObjIdentity p1

p5 partOf p3

p6 partOf p3

In the third stage, the annotator connects participants to events by semantic role links.

SEM_ROLE_LINK

p1=agent (e3)

p2=agent (e1)

p3=patient (e2)

p4=instrument (e4)

p5=theme (e5)

p6=initial location (e5)

p7=patient (e6)

e6=purpose (e4)

p1=agent (e4)

p1=agent (e6)

e2=theme (e1)

e4=theme (e3)

After carrying out this manual annotation in the annotation tool BRAT³, our project's pipeline includes two more modules: the Brat2DRS, which takes the annotation file generated by Brat, parses it, and creates a DRS representation; and the BRAT2Viz, which takes as input the DRS representation, and deploys a web application that produces the visualizations in the form of MSC or KG (Amorim et al., 2021).

6 Conclusion

In this paper, we present an annotation framework for news articles in EP that aims to provide the input for visualization processes. First, we determined what type of information was necessary to account for events and participants in the narratives, and decided that three annotation layers - temporal, referential and thematic - were required. The next step was to decide which tags and links should be used in each layer to fulfill the annotation purposes. Since interoperability is crucial when we talk about semantic resources, three standards ISO 24617-1/4/9 were utilized to create a multilayer semantic annotation scheme. Notwithstanding the fact that these standards are, in fact, themselves three parts of the same standard, when combined, some inconsistencies arise. So, we had to harmonize the three layers, to attain a cohesive annotation framework. Additionally, we sought to balance the amount of information needed to capture the news stories and the load of the annotation process.

Although this model was built to capture the structure of stories in news in EP, its scope is not limited to news nor to EP, as it can be extended to other narrative texts and other languages with some adaptations to deal with genre and language specificities. Moreover, the integration of three different layers in a single annotation framework enables formal semantic representation with DRS, which acts as an intermediate language to generate visualizations in the form of knowledge graphs, for instance.

In the future, we intend to endow our annotation scheme with more granularity. To this end, ISO standard for spatial information (ISO 24617-7) will be added to our framework. For now, spatial annotation has relied on the tags, attributes and

links available in the referential and thematic layers. Likewise, a more detailed information regarding quantification of participants and of events is a component to be improved in the future. At this moment, this kind of information has a very simplified representation solely in the referential layer, which does not fully represent the different possibilities of quantification over entities.

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³ https://nabu.dcc.fc.up.pt/brat/#/examples_demos/paper_ISA-17

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