

# Korean TimeML and Korean TimeBank

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## Abstract

Many emerging documents usually contain temporal information. Because the temporal information is useful for various applications, it became important to develop a system of extracting the temporal information from the documents. Before developing the system, it is first necessary to define or design the structure of temporal information. In other words, it is necessary to design a language which defines how to annotate the temporal information. There have been some studies about the annotation languages, but most of them was applicable to only a specific target language (e.g., English). Thus, it is necessary to design an individual annotation language for each language. In this paper, we propose a revised version of Korean Time Mark-up Language (K-TimeML), and also introduce a dataset, named Korean TimeBank, that is constructed based on the K-TimeML. We believe that the new K-TimeML and Korean TimeBank will be used in many further researches about extraction of temporal information.

**Keywords:** Korean TimeML, Temporal information, Annotation language, Korean TimeBank

## 1. Introduction

Due to the exponentially increasing number of documents available on the Web and from other sources, it has become important to develop methods to automatically extract knowledge from unstructured, natural language documents. The knowledge extracted as such is useful for various applications in the areas of information retrieval (IR), trend analysis (TA), and question answering (QA) systems. Among the many aspects of extracting knowledge from documents, the extraction of temporal information has recently drawn attention. There are two well-known annotation languages of temporal information, Time Mark-up Language (TimeML) (Pustejovsky et al., 2003) and ISO-TimeML. Although these annotation languages define many tags and attributes for representing various types of temporal information, they do not incorporate language diversity. For example, they assume that annotation is performed in the token level. However, Korean is an agglutinative language whose words are formed by joining morphemes together, so it can not be annotated properly in the token level.

As an annotation language for Korean, the Korean TimeML (KTimeML) was proposed (Im et al., 2009), and its contributions can be summarized as follows: (1) it employs a morpheme-level standoff annotation scheme, (2) it takes a surface-based annotation scheme, (3) it suggests to cancel the head-only markup policy of TimeML, (4) it addresses several Korean-specific issues (e.g., the usage of *signal* tag for only temporal connectives), and (5) it introduces the TARSQI Toolkit for the annotation process following the KTimeML. In this paper, we argue that the KTimeML has some limitations, and propose a revised version of the KTimeML. For example, the previous KTimeML did not consider some characteristics of Korean (e.g., a lunar calendar), and the morpheme-level annotation of the KTimeML

makes it difficult to share the dataset. Our new KTimeML overcomes such limitations, and we also introduce the Korean TimeBank constructed using the new KTimeML.

The rest of this paper is organized as follows. Section 2 presents details of the Korean TimeML. Section 3 introduces the Korean TimeBank, and Section 4 concludes the paper.

## 2. Korean TimeML

### 2.1. Limitations of the Previous Korean TimeML

We argue that the previously proposed KTimeML has five limitations. First, although it was proposed as an annotation language for Korean, it misses some characteristics of Korean. Temporal expressions based on the lunar calendar appear often, where the normalized value of such temporal expressions cannot be represented using the Gregorian calendar. For example, for the sentence “어머니 생신은 4월4일이다”(Mother’s birthday is on the 4th day of the 4th month in the lunar calendar), the normalized *value* of ‘the 4th day of the 4th month’ will be different on different years in the Gregorian calendar (e.g., ‘2015-05-21’ for the year 2015, ‘2014-05-02’ for the year 2014). Moreover, there are some temporal expressions conveying vague temporal information that appear often in Korean. For example, ‘초중반[cho-joong-ban]’ represents the beginning or middle phase of a period, and ‘중후반[joong-hoo-ban]’ represents the middle or ending phase of a period. There is no way to annotate these expressions using the previous KTimeML.

Second, there are temporal expressions conveying periodic patterns that can not be annotated using the previous KTimeML. For the sentence “I visit there twice every week, each of which takes one day”, there is no way to annotate the expression ‘every week’ because the attribute *freq* of

*timex3* tag can not represent ‘twice’ and ‘one day’ simultaneously. The reason for this limitation is the inconsistent usage of the attribute *freq*. That is, the *freq* is used to annotate not only a periodic frequency (e.g., ‘twice’), but also a periodic duration (e.g., ‘one day’). When these two periodic patterns appear simultaneously, then the temporal expressions will not be annotated properly using the previous KTimeML.

Third, the previous KTimeML takes a morpheme-level annotation. From a linguistic point of view, morpheme-level annotation seems perfect because the smallest meaningful unit of Korean is the morpheme. However, from a practical point of view, morpheme-level annotation makes it difficult to distribute or share the dataset. The reason is that there are multiple tag-sets of morphemes, so the datasets using different tag-sets will not be consistent with each other. Even if all the datasets are commonly based on a single tag-set, they will not be consistent unless they use the same morphological analyzer. Because the essential purpose of annotation language is to help to distribute or share the dataset, morpheme-level annotation must be avoided.

Fourth, different attribute names are used to denote the IDs of different tags. For example, *tid* is used for *timex3* tags, and *lid* is used for *tlink* tags. One may argue that using the different attribute names to denote IDs will make the various kinds of tags easier to recognize. However, in terms of further applications that make use of temporal information, it is not necessary to use various attribute names to denote tag IDs the kind of tag is already known when its attributes are parsed. Rather, using different names to denote IDs makes it complex to implement programs to parse the tag attributes.

Fifth, similar to ISO-TimeML, an *event* tag plays two roles: the role of an event token and the role of an event instance. Given the sentence “Kevin taught English yesterday and today”, there will be two *event* tags as follows.

```
<EVENT eid="e1" morph="m1" pred="TEACH"
  class="OCCURRENCE" tense="PAST"
  polarity="POS"/>
<EVENT eid="e2" pred="TEACH"
  class="OCCURRENCE" tense="PAST"
  polarity="POS"/>
```

The first *event* tag has the two roles (e.g., a role of an event token and a role of an event instance), while the second *event* tag has only the role of an event instance. From a practical point of view, this inconsistent functionality of *event* tags may cause difficulty in parsing of the annotated *event* tags, which would result in the inefficiency of further applications. In other words, it would be necessary to implement a program to recognize the role of the *event* tag, which would slow down the applications.

## 2.2. Modified Korean TimeML

To address the limitations of the previous KTimeML, we revise the KTimeML by introducing some additional attributes and modifying some existing attributes. In terms of the first limitation, we add an attribute *calendar* of *timex3* tag to denote the calendar types, where its value can be LU-

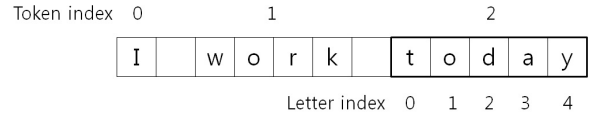


Figure 1: Sample of the character-level annotation.

NAR, JULIAN, or any other types of calendar. The default value of *calendar* is GREGORIAN when it is not explicitly clarified. To annotate expressions conveying vague temporal information, we introduce two values START\_MID and MID\_END to the attribute *mod* of *timex3* tag. The value START\_MID represents the beginning or middle phase of a period (e.g., ‘초중반[cho-joong-ban]’) and the value MID\_END represents the middle or ending phase of a period (e.g., ‘중후반[joong-hoo-ban]’).

To address the second limitation, we introduce an additional attribute *prd* of *timex3* tag, where it is used to represent periodic duration based on ISO-8601. The existing attribute *freq* of *timex3* is also modified so that it is used to represent only the periodic frequency. This role separation between *freq* and *prd* makes it possible to annotate temporal expressions that could not be annotated using the previous KTimeML. For example, given the sentence “I visit there twice every week, each of which takes three hours”, the *timex3* tag of ‘every week’ will have *freq*=‘2X’ and *prd*=‘PT3H’.

To address the third limitation, we propose taking a character-level annotation. Character-level annotation will make the dataset independent of morpheme tag-set and morphological analysis, which in turn makes it easy to distribute or share the dataset. To realize character-level annotation, we replace the attribute *morph* with five attributes *e\_begin*, *e\_end*, *begin*, *end*, and *text*. The attributes *e\_begin* and *e\_end* indicate token indices of the extent, while *begin* and *end* indicate character (letter) indices of the extent. For example, the sentence, “I work today” in Fig. 1, contains one *timex3* tag whose *text* is ‘today’, where *e\_begin*=2, *e\_end*=2, *begin*=0, and *end*=4. One may argue that the *e\_begin* and *e\_end* represent the token-level information, so it seems that the proposed annotation does not take the character-level annotation. It is true that these two attributes may seem unnecessary, because the other two attributes *begin* and *end* carry the character-level information. However, it is important to notice that the annotation language is used by not only computers, but also by human. Using only *begin* and *end* will be enough for the computers to work, but not for human annotators. The usage of *e\_begin* and *e\_end* helps human to easily annotate new corpus or to check an annotated corpus. For example, given a sentence “There were many works I had to do, but I left it yesterday”, human annotators have to annotate ‘yesterday’ with *timex3* tag. Without using *e\_begin* and *e\_end*, it will make the annotators hard to annotate, because the annotators have to count the number of preceding characters. Furthermore, it will also be more difficult to read or check whether the annotated *timex3* tag is correct or not, due to the same reason. Thus, the two attributes are necessary to help human annotators.

```

<?xml version="1.0" encoding="utf-8"?>
<doc id="강도하.txt.out" url="http://ko.wikipedia.org/wiki/%EA%B0%95%EB%84%ED%95%98" category="대한민국의만화가" date="2013-03-09T14:38">
  <contents>
    <sentence id="0">강도하는 대한민국의 만화가이다.</sentence>
    <sentence id="1">본명은 강성수이다.</sentence>
    <sentence id="2">2004년8월부터 '강도하'라는 필명으로 작품 활동을 하고 있다.</sentence>
  </contents>
  <timeAnnotation>
    <annotationInfo sentence_id="0">
      <text>강도하는 대한민국의 만화가이다.</text>
      <tag>
        <event id="TIME_S0_e0" begin="3" end="3" text="이" class="STATE" e_begin="2" e_end="2" />
        <makeinstance id="TIME_S0_ei0" eventID="TIME_S0_e0" POS="VERB" tense="NONE" polarity="POS" />
      </tag>
    </annotationInfo>
    <annotationInfo sentence_id="1">
      <text>본명은 강성수이다.</text>
      <tag>
        <event id="TIME_S1_e0" begin="3" end="3" text="이" class="STATE" e_begin="1" e_end="1" />
        <makeinstance id="TIME_S1_ei0" eventID="TIME_S1_e0" POS="VERB" tense="NONE" polarity="POS" />
      </tag>
    </annotationInfo>
    <annotationInfo sentence_id="2">
      <text>2004년8월부터 '강도하'라는 필명으로 작품 활동을 하고 있다.</text>
      <tag>
        <timex3 id="TIME_S2_t0" type="DATE" value="2004-08" begin="0" end="6" text="2004년8월" e_begin="0" e_end="0" />
        <event id="TIME_S2_e0" begin="0" end="3" text="작품활동" class="OCCURRENCE" e_begin="3" e_end="4" />
        <makeinstance id="TIME_S2_ei0" eventID="TIME_S2_e0" POS="NOUN" tense="PRESENT" polarity="POS" />
        <tlink id="TIME_t10" eventInstanceID="TIME_S2_ei0" relatedToTime="TIME_S2_t0" relType="BEGINS" />
      </tag>
    </annotationInfo>
  </timeAnnotation>
</doc>

```

Figure 2: Sample annotated sentences of Korean TimeBank.

To address the fourth limitation, we just use the same attribute name *id* for every tag, as ISO-TimeML does. To address the fifth limitation, we employ a *makeinstance* tag, which is also adopted by TempEval shared tasks (Verhagen et al., 2009; Verhagen et al., 2010; UzZaman et al., 2013). The *makeinstance* tag takes the role of an event instances, while the *event* tag has only the role of an event token. This clear separation of the two roles will help the further applications to easily analyze *event* tags. As there is at least one instance for each event token, the number of *event* tags is always smaller than or equal to the number of *makeinstance* tags.

### 3. Korean TimeBank

There are some existing Korean datasets of temporal information. A Korean dataset constructed using *timex2* was introduced (Jang et al., 2004), where *timex2* is the former version of *timex3*. The first Korean dataset using *timex3* appeared in TempEval-2, which provides datasets of six languages: Chinese, English, French, Italian, Spanish, and Korean. However, the Korean dataset of TempEval-2 is small in size (e.g., totally 26 documents) and has many annotation errors. There are some missing *values* of *timex3* tags, and there are some tags that must be merged into one. An example of the errors can be found at the 11th sentence of the 2nd training document within the TempEval-2 Korean dataset. Moreover, it is annotated in the morpheme level, which implies that it will not be consistent with other datasets. Thus, we introduce a new Korean dataset, namely Korean TimeBank, which is annotated in the character level.

The source of the Korean TimeBank includes Wikipedia documents and hundreds of manually generated question-answer pairs. The domains of the Wikipedia documents are personage, music, university, and history. The annotation is performed by two well-trained annotators majoring in computer science and examined by a supervisor. The statistics of the Korean TimeBank are summarized in Table 1, and the Korean TimeBank will be extended regularly. The Kappa coefficient  $\kappa$  is described in Table 2.

Similar to TempEval tasks, it adopts four tags: *timex3*, *event*, *makeinstance*, and *tlink*. The main target applica-

Table 1: The statistics of Korean TimeBank.

Item	The number of items
document	1078
sentence	4053
timex3	2552
event	11522
makeinstance	11577
tlink	3985

Table 2: Kappa coefficient of Korean TimeBank.

Tag	Kappa coefficient
timex3	0.9983
event	0.9889
makeinstance	0.9930
tlink	0.9284

tion of the Korean TimeBank is question answering (QA) systems, so a part of the new KTimeML is adopted with the consideration of the target application. The adopted attributes of the *timex3* tag are *id*, *type*, *value*, *beginPoint*, *endPoint*, *e\_begin*, *e\_end*, *begin*, *end*, *text*, *freq*, *prd*, *quant*, *mod*, *calendar*, and *comment*. The adopted attributes of the *event* tag are *id*, *class*, *e\_begin*, *e\_end*, *begin*, *end*, *text*, and *comment*. The adopted attributes of the *makeinstance* tag are *id*, *eventID*, *polarity*, *tense*, *POS*, *modality*, *cardinality*, and *comment*. The adopted attributes of the *tlink* tag are *id*, *eventInstanceID*, *timeID*, *relatedToEventInstance*, *relatedToTime*, *relType*, and *comment*.

The annotated tags of each document are saved as a separate file in XML format, and a sample file is shown in Fig. 2. The *id* of the document in Fig. 2 is a file name, and a *url* indicates the source of the document. The *category* is the category of the document (e.g., category of Wikipedia documents), and *date* represents the Document Creation Time (DCT). The *contents* contains original sen-

tences, while *timeAnnotation* contains pairs of an original sentence and annotated tags. This stand-off scheme allows the original sentences to be kept unharmed. Each *annotationInfo* of *timeAnnotation* contains the pair of an original sentence and tags within a sentence, where *sentence\_id* is an index of the sentence. The *text* of *annotationInfo* is the original sentence, and *tag* contains the annotated tags.

#### 4. Conclusion

As there are several limitations of the previous Korean TimeML (KTimeML), we proposed a new modified version of KTimeML and introduced a Korean TimeBank constructed using a part of the new KTimeML. We believe that the Korean TimeBank will be widely used for many Korean-based studies and applications related to temporal information, because this is the first high-quality Korean dataset that is independent to any tag-sets or morphological analysis tools because it is annotated in the character level.

#### 5. Acknowledgements

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