Bio-event definition in text mining towards event interconnection

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Introduction
Event extraction is one of the main focuses in bio-text mining (TM). Interconnecting extracted events into reaction networks provides biologists with a wealth of fine-grained information on biochemical reactions [1]. Intuitively, extracted events could be connected into networks based on common entities. However, this approach is limited due to: 1) its dependence on flawless entity normalisation; 2) inability to express the directionality of the various relations/reactions. To enrich the information in extracted events and facilitate their interconnection, we propose a modification to bio-event definition to make it more compatible with the structure of biological reactions and community-supported biological semantic resources. More specifically, we propose alignment of bio-events with the reactions in the Systems Biology Markup Language (SBML), which would make bio-events more biologically meaningful and directly re-usable by domain experts.

Background
The last decade has seen increased interest and rapid advance in the semantic study of biology, resulting in a number of semantic knowledge resources proposed by the bio community. The Systems Biology Markup Language (SBML) [2] is a successful example of such efforts. SBML is a machine readable and transferable format depicting biological/biochemical reaction networks. It has been widely adopted and has been used for encoding a broad range of biological networks.

Ohta et al. [3] compared SBML with the event definitions in the series of GENIA tasks, pointing out that bio-event types in the current TM tasks are insufficient for covering all types of biochemical reactions in existing networks. The latter tasks in the BioNLP series try to expand the coverage of more types of bio-events [4].

We argue below that not only would we require more types of events but also a modification to current event structure.

BioNLP events and biological reactions
The main arguments of an event defined in the latest BioNLP’13 GE task consist of Theme and Cause [5]. While Theme and Cause have a direct correspondence to the notions of Patient and Agent respectively, in linguistics thematic relations, assignment of these arguments delivers insufficient information about the roles of participants in reactions.

Consider the following two sentences annotated with BioNLP events, shown in Figure 1. The gene expression, GE1, in sentence A is a theme of a negative regulation. In sentence B, the gene expression, GE2, also is a theme of a negative regulation. However, the roles of the two gene expression (GE) events are very different, with GE1 being passively regulated in contrast to GE2, which is actually regulating another event in the sentence.

By contrast, when we look at an SBML file, it encodes a network as a set of biochemical reactions interconnected by the participants. The main elements of each reaction include reactants, modifiers and products which respectively denote the substances involved in, influencing and produced by the reaction.

The BioNLP 2013 Pathway Curation (PC) task [6] has augmented the Theme and Cause arguments by including Products and Participants. However, several issues remain unresolved. For example, a protein modification event in the PC task contains a single Theme. This is based on the knowledge that such events occur between proteins and certain molecules, which always result in the binding of the two. Without explicitly mentioning the...
products though, computers would not be able to automatically interconnect such events via, for example, coreference. Moreover, regulatory events cannot be incorporated into a gene expression event as modifiers if the event is not provided in a directional format. Modifiers are also missing for many events.

Figure 2 shows how an SBML reaction is abstracted from text. The example uses an inferred protein complex to facilitate future sensible entity coreference, as a protein complex in the first clause refers to the complex in the second clause. Therefore, if we tune event extraction output to distinguish between reactants, products and modifiers, the output will be more biologically informative and enable easier event interconnection.

Proposed amendments to event definition

We use examples selected from the BioNLP’13 GE task and illustrate a possible extension to the current format for all event types in the task (Table 1). This can be extended to other tasks. The format focuses on enhancing the information capabilities of theme and cause. It could be potentially used for mapping the existing BioNLP annotations to the more SBML-compatible format.

Figure 1 An example of Theme and cause illustrates that the directionality of event is missing.

Figure 2 An example of SBML. A is the sentence describing the process. B is the diagram depicting the three main elements of an SBML reaction, which are reactants, modifiers and products. No modifier is involved in the example reaction (grey dash line). C is the SBML snippet encoding the binding process.
Gene expression (GE) is the process of synthesizing proteins from genetic codes. The same term is used to refer to a gene and gene product, e.g. protein. Therefore, the same gene name is used for both reactant and product. As a sub-process of GE, Transcription could take the same approach. So, the GE example in Table 1 could have IL-10 as the reactant.

Protein catabolism is the process of proteins breaking into amino acids. Therefore, if the mentions of generated amino acids appear along a broken protein, the amino acid names should be annotated as products. Meanwhile, if the names of related proteases occur, they should be annotated as modifiers.

Binding is the formation of macromolecules by the aggregation of two or more molecules. Generated molecules, physical clusters of the original macro-molecules will constitute the products. In Table 1, the inferred cluster could be named after the conjunction of the reactants. This can help event interconnections to produce more sensible reaction cascades. For example, in “post-translational modification state of CD40-associated HOIP”, post-translational modification is taking place on the macromolecule consisting of CD40 and HOIP instead of either of them. If the product of the binding of CD40 and HOIP is named as CD40 HOIP, the downstream encoding of protein modification can use CD40 HOIP as the reactant.

The more specific Protein modification types include phosphorylation, ubiquitination, acetylation, and deacetylation. These processes attach specific chemicals onto other molecules. Therefore, the products of these processes can be inferred in a similar way as for binding.

Regulations including positive and negative regulations are the processes, which catalyze or inhibit other processes without producing anything via the actual regulation process per se. They are akin to the notion of modifiers defined in SBML. We propose that regulations should be incorporated into the processes they have influenced. This would merge regulation events with others. For example, “Addition of U0126 to the cultures abrogated the production of IL-10” could be extracted as a gene expression event of IL-10 with U0126 as the modifier rather than an extra regulation event of U0126, although the extraction may be technically achieved in two steps.

Table 1. Examples for the event types from BioNLP’13 GE task

| Reactants | Modifiers | Products | Example |
|-----------|-----------|----------|---------|
| Gene exp  | IL-10     | IL-10    | IL-10 production |
| Transcription | MBP mRNA | MBP mRNA transcription |
| Protein cata | p100     | degradation of the p100 NF-kB protein |
| Binding    | HOIP, CD40 | HOIP CD40 (inferred) | the association of HOIP with CD40 |
| Localization | ΔFNH    | localization of ΔFNH |
| Protein modi | p65      | Post-translational modification of NF-kB p65 |
| Phosphorylat | NF-kB    | NF-kB pho (inferred) | NF-kB p65 phosphorylation |
| Ubiquitinati | I-kBα    | I-kBα ubi (inferred) | ubiquitination, and subsequent degradation of I-kBα |
| Acetylation | p65      | p65 ace (inferred) | Acetylation of p65 |
| Deacetylation | p65 histone deacetylase-3 | p65 dea (inferred) | Deacetylation of p65 by histone deacetylase-3 |
| Regulation | Ser536 TRAF2 | HOIP | Example 1: point mutation at Ser536 Example 2: HOIP functions downstream of TRAF2 |
| Positive reg | PKCa | M-CSF | M-CSF-stimulated PKCa |
| Negative reg | MEK1, MEK2 | Inhibits MEK1 and MEK2 |

Discussion

Event interconnection requires further research into entity coreference, event coreference and discourse analysis. Encoding extracted and inferred information from bio-events into SBML format can help by maintaining reaction directionality and enabling meaningful coreference.

This position paper argues that it is possible and indeed advantageous to enhance the output formats of extracted bio-events and make them compatible with the widely used SBML format for biological reactions. The format can be further refined to meet the complexity of bio-events. A possible first step would be to use the enhanced format to annotate existing corpora, e.g. those from BioNLP tasks or adapt them to the new format semi-automatically.

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