The Gene Ontology (GO) project (GO-EBI, EMBL-EBI, Wellcome Trust Genome Campus, Hinxton, Cambridge CB10 1SD, UK)

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ABSTRACT

The Gene Ontology (GO) project (http://www.geneontology.org) develops and uses a set of structured, controlled vocabularies for community use in annotating genes, gene products and sequences (also see http://song.sourceforge.net/). The GO Consortium continues to improve to the vocabulary content, reflecting the impact of several novel mechanisms of incorporating community input. A growing number of model organism databases and genome annotation groups contribute annotation sets using GO terms to GO’s public repository. Updates to the AmiGO browser have improved access to contributed genome annotations. As the GO project continues to grow, the use of the GO vocabularies is becoming more varied as well as more widespread. The GO project provides an ontological annotation system that enables biologists to infer knowledge from large amounts of data.

INTRODUCTION

The Gene Ontology (GO) project (http://www.geneontology.org) is a collaborative effort to construct and use ontologies to facilitate the biologically meaningful annotation of genes and their products in a wide variety of organisms. Groups participating in the project include the major model organism databases and other bioinformatics resource centers.

The GO Ontologies provide a systematic language, or ontology (1–4), for the description of attributes of genes and gene products, in three key domains that are shared by all organisms, namely molecular function, biological process and cellular component (5–10); sequence features are covered by the Sequence Ontology, maintained separately from the GO ontologies (11).

The GO annotations have proven to be remarkably useful for the mining of functional and biological significance from very large datasets, such as microarray results. The GO also facilitates the organization of data from novel, as well as fully annotated, genomes and the comparison of biological information between clade members and across clades.

IMPROVEMENTS IN GO CONTENT

From its inception, the GO project has developed its ontologies for the purpose of gene product annotation. To this end, the Gene Ontology is dynamic: existing terms and relationships are augmented, refined and reorganized as the current state of biological knowledge advances. Major improvements have been made over the past 2 years in several areas of the ontology, often in consultation with experts in relevant subject areas. The Plant-Associated Microbe Gene Ontology (PAMGO) Interest Group collaborated with the GO Consortium to produce a new set of terms representing pathogenic and symbiotic processes (also see below). With help from
representatives of the BioCyc databases, the GO representation of metabolism was split into cellular and organismal processes. The cell cycle node was extensively reworked and is undergoing further improvement. Finally, high level terms were added to the cellular component ontology to better categorize terms representing the constituents of cells. A summary of the current ontology content is shown in Table 1.

MANAGING CONTENT CHANGES

All changes to the ontologies are centrally coordinated by the GO Editorial Office (located at the European Bioinformatics Institute, Hinxton, UK). Changes are proposed by GO curators, model organism database annotators and other interested parties throughout the biological community. GO curators have adapted the online tracking system provided by SourceForge to document progress (see http://geneontology.sourceforge.net/); as of September 1, 2005, over 2800 items have been posted, of which over 2100 have led to changes in the ontologies.

The model organism database curators who use GO terms intensively for gene product annotation play a key role in guiding the development of GO. To complement their input, the GO Consortium strives to involve members of the biological research community in the ontology development process. Experts in various biomedical fields provide thorough, detailed knowledge of their particular topics that complements GO curators’ understanding of existing GO structures and conventions.

To promote communication among these various contributors and ensure consistency within the ontology, the GO Consortium has established Curator Interest Groups and has initiated a series of meetings devoted to ontology content; both provide mechanisms to focus on areas within the ontologies that are likely to require extensive additions or revisions. Curator Interest Group membership is open not only to Consortium members, but also to community experts in the field. A list of the 29 current Interest Groups can be found at http://www.geneontology.org/GO.interests.shtml.

GO content meetings serve to bring GO curators and biologists together to resolve specific sub-trees of the GO structure. Many of the recent improvements in GO stem from the first content meeting, held in August 2004, where members of the GO group and domain experts in plant pathogens (PAMGO), the cell cycle and metabolism participated.

Table 1. Current status of GO

| Term Type                  | Count       |
|---------------------------|-------------|
| Biological process terms  | 9805        |
| Molecular function terms  | 7076        |
| Cellular component terms  | 1574        |
| Sequence Ontology terms   | 963         |
| Molecular function terms  | 7076        |
| Biological process terms  | 9805        |
| Total (including annotation) | 1 618 739 |
| Electronic only           | 1 460 632   |
| Manually curated          | 158 107     |

*Excludes annotations from UniProt, which represent 261 annotated proteomes.

INCREASING ANNOTATION COVERAGE AND QUALITY CONTROL

Alongside the development of GO ontology content, the use of GO terms for gene product annotation has increased substantially. Annotation data are now subject to checks to maintain file format integrity and avoid redundancy, and GO Consortium member groups are developing measures to assess the accuracy and consistency of annotations made by different individuals or groups [for example see (12,13)].

Furthermore, the GO Consortium has recently begun an effort to actively support new groups seeking to use GO for gene product annotation and to make the resulting annotation data available to the public as part of the GO repository. GO annotations are now available for over 30 genomes [plus many additional species, including 261 proteomes, via UniProt (14)], with recent additions including chicken and several prokaryotes.

GO ANNOTATION CAMPS

This attention to annotation outreach has led the GO Consortium to initiate a series of meetings devoted to GO annotation practices. These meetings, known as ‘Annotation Camps’, review and refine the approaches that the GO Consortium now takes to improve the coverage, accuracy and precision of GO annotation data. At the first Annotation Camp, held in June 2004, GO Consortium members focused on developing and maintaining consistent annotation practices within and among groups. The second Annotation Camp, held in June 2005, was larger and open to non-members (about two-thirds of the participants), and thus served to help educate people unfamiliar with the GO system, as well as continuing to work toward the consistency goals of the first Camp. Each Annotation Camp introduced the basic organization of the GO and covered a number of practical aspects of its use. A key component of the Annotation Camps was the review of example papers by working groups, to improve the consistency of gene product annotation based on literature.
In addition to the Consortium-wide Annotation Camps, some GO Consortium members, such as The Institute for Genomic Research, run their own annotation courses and make annotation tools publicly available; individual database curators may also learn directly from ‘mentors’ with extensive experience using the GO system.

SOFTWARE DEVELOPMENTS

The GO Consortium provides software tools to navigate, use and manipulate the GO terms and annotations. Many new features have been added to the Java-based editing tool DAG-Edit (http://godatabase.org/dev/), and its successor, OBO-Edit, is in beta testing. OBO-Edit adds support for many of the advanced features of ontology languages, such as OWL. GO and OBO-Edit are also closely coordinated with the development of Obol, a formal language for specifying ontology terms (15).

AmiGO (http://www.godatabase.org/cgi-bin/amigo/go.cgi) is a web resource developed by the GO Consortium for searching and browsing the Gene Ontology terms and gene product annotations. Recent enhancements include expanded searching of the ontology and gene products as well as improved display of search results. Synonyms, which may include phrases and terminology familiar to biologists and which clarify the meanings of GO terms, are now included in the GO term search and display. In addition, AmiGO now searches all available gene and gene product names provided by the annotation groups. The displays of search results and annotation data have been improved, as shown in Figure 1.

APPLICATIONS OF GO DATA

In parallel with the growth of annotation coverage, GO’s resources are now used in a number of different applications. The GO Bibliography, a collection of peer-reviewed literature on the development and usage of GO, has grown to over 600 publications (see http://www.geneontology.org/cgi-bin/biblio.cgi), documenting a number of novel uses of GO.

GO and gene expression

Among the most widespread applications of GO data is the use of GO terms and gene product annotations to help interpret the results of large-scale experiments, such as microarrays, in which any correlation between the functional information captured by GO and the expression patterns of a set of genes can help to highlight underlying biological phenomena. A large number of software tools have been developed to facilitate the analysis of gene expression data using GO (for a partial list see http://www.geneontology.org/GO.tools.microarray.shtml), and a paper reviewing the relative merits of a subset of these tools has recently been published (16).

GO terms and annotations have also been put to a variety of other uses, in both the biological and computer science communities. Biologists have used GO for tasks, such as gene function prediction (17), collaborative construction and analysis of cellular pathways (18), and association of genes to genetically inherited diseases (19). GO terms have also been incorporated into the Unified Medical Language System (UMLS) (20) maintained by the US National Library of Medicine (21). In the computer science community, GO has been used as a test of applying description logic (22,23) approaches to building sound, complete and logically consistent ontologies (22,24), and has featured in research into machine-processable ontologies (25) and into the automated checking of ontological consistency (26). Notably, GO terms offer a valuable standardized terminological resource to natural language processing researchers, facilitating information extraction from texts, knowledge discovery and ontology building from large collections of documents. For example, GO terms have been used in the Textpresso text mining system and in the BioCreAtIvE text mining assessment (13,27,28).

The NCI cancer biomedical informatics grid (caBIG) initiative and GO

The GO has been adopted by the caBIG initiative (https://cabig.nci.nih.gov/), enabling the cancer community to analyze microarray and proteomic data. Several available tools are now being integrated into caBIG, including GOminer (29,30), caArray, caWorkbench, RProteomics, Bioconductor (31), Reactome (32) and the cancer Pathways Interaction Database. In addition, caBIG has been integrating the Gene Ontology into the NCI Metathesaurus, Enterprise Vocabulary System and the cancer Data Standards Repository so that any caBIG project, dataset, or tool can take advantage of the GO. The GO has become the unifying terminology for the description and annotation of biological process, localization and function of gene products throughout the cancer research community.

ADDITIONAL ONTOLOGIES FOR BIOLOGY: OBO

The Gene Ontology is one of the ontologies held in the Open Biomedical Ontologies (OBO) collection (http://obo.sourceforge.net/). By providing controlled vocabularies that are freely available, OBO aims to extend GO development principles to many additional biological domains. There are currently over 40 ontologies lodged in OBO, covering domains such as anatomy, development, and phenotype, genomic and proteomic information and taxonomic classification. In addition to GO, OBO includes a relationship types ontology and the Sequence Ontology.

The OBO relationship types ontology (http://obo.sourceforge.net/relationship/) is an ontology of core relationship types, such as is_a, part_of, located_in and derives_from, with explicit definitions, to be used by all ontologies in the OBO collection (33).

SO: the Sequence Ontology

The Sequence Ontology (SO) provides terms and relationships for describing the features and attributes of biological sequences, e.g. DNA, RNA and proteins. Its purpose is to promote the standardization of sequence annotation among different organisms (34). The ontology currently contains 963 terms and 16 relationship types. A subset of the terms and relationships that describe located sequence features, known as SOFA (Sequence Ontology Feature Annotation), have been selected to provide a basic vocabulary to describe the products of automatic genome annotation efforts. SOFA is in its second release, and contains 179 terms. Ongoing development of both
SO and SOFA proceeds via feedback and discussion from the annotation community through a mailing list and through soliciting the advice of domain experts.

The Sequence Ontology is primarily used to specify the type of annotation features in flat files [e.g. GFF3 (10)] and databases (e.g. CHADO, a relational database schema) (http://song.sourceforge.net/so_compliant_formats.shtml). SO and SOFA are currently being used to describe the annotations of several model organism genomes, both by automated pipeline and manual curation (http://song.sourceforge.net/so_groups.shtml). To facilitate integration with existing genome annotation projects, SO terms have been mapped to homologous terms in other biological vocabularies, such as the MGED ontology (35) and the GenBank feature table (36). These mappings are available on the web (http://song.sourceforge.net/so_mappings.shtml).

THE FUTURE OF GO

Ontology content

Work on immunology and on responses to stimuli is planned, and appropriate contacts are being made. The GO Consortium
also hopes to tackle the areas of transport, signaling and neurobiology in the near future.

**Gene product annotation**

The GO Consortium will continue to update existing annotation datasets and work with new database groups that will annotate more species. In addition, curators and software developers will devise systems to enable bench scientists to contribute annotations for their domains of expertise.

**Software/AmiGO**

Further development and enhancement of AmiGO will make additional information about the organization of the ontology available and provide more up-to-date access to the annotations.

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