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# Gene Ontology and the annotation of pathogen genomes: the case of *Candida albicans*

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# Abstract

The Gene Ontology (GO) is a structured controlled vocabulary developed to describe the roles and locations of gene products in a consistent fashion, in a way that can be shared across organisms. The unicellular fungus *Candida albicans* is similar in many ways to the model organism *Saccharomyces cerevisiae*, but as both a commensal and a pathogen of humans, differs greatly in its lifestyle. With an expanding at-risk population of immunosuppressed patients, increased use of invasive medical procedures, the increasing prevalence of drug resistance, and the emergence of additional *Candida* species as serious pathogens, it has never been more critical to improve our understanding of *Candida* biology to guide the development of better treatments. In this brief review, we examine the importance of GO in the annotation of *C. albicans* gene products, with a focus on those involved in pathogenesis. We also discuss how sequence information combined with GO facilitates the transfer of knowledge across related species, and the challenges and opportunities that such an approach presents.

# Introducing *Candida albicans*, a pathogen of increasing relevance in the present day

*Candida albicans*, the best studied of the human fungal pathogens, is a frequent commensal of humans and is responsible for mucosal infections, such as vaginitis or oral thrush, in otherwise healthy individuals. However, systemic Candida infection is a serious threat to severely ill or immunocompromised patients, including low-birthweight infants, transplant recipients, chemotherapy patients, burn victims, and HIV-infected patients [1, 2]. In addition, C. albicans can readily colonize catheters and other medical devices, where it forms biofilms that are significantly more resistant to drug treatment than are planktonic (individual free-floating) cells [3, 4]. For these reasons, C. albicans has become the third or fourth most common cause of nosocomial bloodstream infections, and mortality rates from systemic *Candida* infection are high [5, 6]. Emerging resistance to the existing arsenal of antifungal drugs is also of increasing concern, and azole resistance is now common among isolates from HIV-positive patients [7]. Additionally, other fungal species are emerging as pathogens of increasing prevalence and concern [8]. Thus, the need for new and more effective strategies to combat these infections, as well as those caused by other fungal pathogens for which C. albicans can serve as a model, has driven recent studies designed to elucidate the molecular basis of C. albicans virulence. Genomic-scale experiments are powerful tools that can provide insight into pathogenesis and other processes at a molecular level, but which require a well-annotated gene catalog. The Gene Ontology (GO) vocabulary is a classification system of particular utility for this purpose (see: http:// www.geneontology.org).

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# Introducing the Gene Ontology

GO comprises three hierarchical controlled vocabularies and a set of evidence codes. These three vocabularies contain terms to describe the location of a gene product within the cell (Cellular Component), the activity that it carries out (Molecular Function), and the broader role that it fulfills (Biological Process). Each term is related to both the less-specific "parental terms" that are placed above it in the hierarchical tree, as well as to the more specific "child" terms that it encompasses. The evidence codes describe the type of inference that was used to make each GO annotation to a gene product and, as such, indicate a level of confidence. A gene product may be annotated with any number of terms from any of the three vocabularies, depending on the available data. Direct annotation to a particular term also implies indirect annotation to all terms from which that term is descended. For example, a protein annotated to the Cellular Component term "mitochondrial inner membrane" is also implicitly annotated to "mitochondrial membrane" in the Cellular Component vocabulary.

#### Candida albicans biology and pathogenic strategies

Genetic diversity is crucial to adaptation and survival in the diverse and often hostile environments within the host. *C. albicans* usually exists in a diploid or near-diploid state, and has never been observed to undergo meiosis. However, diploids that become homozygous at the mating-type-like (MTL) locus can mate to form tetraploids in a tightly regulated process that requires morphological switching from the nonmating "white" cell type to the mating-competent "opaque" cell type [9-12] (Figure 1a). Genetic recombination occurs in resulting tetraploids, which then shed chromosomes to return to diploidy in a process termed the parasexual cycle [13, 14]. Another mechanism leading to genetic diversity is the frequent occurrence of aneuploidy and gross chromosomal rearrangements (such as isochromosome formation, during which one chromosome arm is duplicated and the other arm is lost), for which *C. albicans* exhibits a remarkable tolerance. Such events can confer selective advantages with respect to drug resistance and capacity for metabolism of specific nutrients [15-17].

C. albicans grows in several morphological forms, including: (i) a budding yeast form that can switch from the smooth-walled white phase to the rough-walled, mating-competent opaque phase, (ii) pseudohyphal filaments, and (iii) filaments with a true hyphal morphology (Figure 1b) [18, 19]. The ability to switch morphology is essential for its pathogenicity, as different growth forms exhibit differential success in the various ecological niches encountered in the host [20, 21]. Yeast-form cells are more amenable to dispersal in the bloodstream, while hyphae exhibit adhesive and mechanical properties that allow them to penetrate host cell membranes [22, 23]. Engulfment of yeast-form cells by host macrophages induces a stress response to the low-glucose conditions therein and triggers a switch to hyphal growth, which facilitates physical escape from this hostile environment [24], as well as other changes in gene expression that can affect the properties of macrophages to benefit the pathogen [25]. White- and opaque-phase cells are adapted to growth in different niches, and white-opaque switching is an infrequent event under most conditions studied. However, this switching is greatly induced in the WO-1 strain in the mammalian gastrointestinal tract, though other tested strains did not show such an induction, suggesting that there is genetic variation in control of this response [20].

The capacity to grow in a multicellular community known as a biofilm is an important component of *C. albicans* pathogenicity, allowing it to grow on catheters and other medical devices, and dental prostheses. Compared to planktonic cells, cells in biofilms exhibit a

remarkable resistance to drugs, which complicates patient treatment [4, 26-28]. Biofilm formation depends on a means of cell-to-cell communication, and *C. albicans* exhibits signaling responses to cell density (quorum sensing) that regulate growth and probably facilitate its survival in the host [29, 30].

The acquisition of drug resistance is another important component of *C. albicans* virulence in the clinical setting. It can readily develop resistance to antifungal drug treatment via multiple mechanisms, including regulation of drug efflux transporters (e.g., Cdr1p, Cdr2p, and Mdr1p [31]), mutation of drug targets (e.g., Erg11p, lanosterol 14-alpha-demethylase, the target of azole antifungals [32]), mutation of regulatory factors (e.g., Tac1p, a transcriptional regulator of drug efflux [15]), and chromosomal rearrangements [15, 17, 33].

# Candida albicans in the "genomic age"

The genomic sequence of *C. albicans* strain SC5314 was published in 2004 as an assembly comprising 266 contiguous segments across a haploid reference genome [34]. Subsequently, using these contigs as a starting point, a chromosome-level assembly was constructed [35]. Publication of the sequence served as a springboard to the genomic age [36, 37], and numerous genomic resources have been developed for *Candida* [38, 39], several of which have been made widely available to the research community (e.g., CandidaDB: http:// genodb.pasteur.fr/cgi-bin/WebObjects/CandidaDB, Broad Fungal Genome Initiative: http:// www.broad.mit.edu/node/304, Sanger Institute: http://www.sanger.ac.uk/Projects/Fungi/, Genolevures: http://www.genolevures.org/yeastgenomes.html; also see http:// www.candidagenome.org/CommunityNews.shtml). The recent availability of genome sequences for related pathogenic and non-pathogenic fungi has enabled the use of comparative genomics approaches to refine the ORF catalog and gene annotation, as well as to examine gene families that have expanded in the pathogenic fungi.

The genome-scale experimental approaches (such as microarrays) that are now available for research into *Candida* pathogenesis mechanisms can generate large volumes of data, including long lists of genes of interest, providing a significant challenge to make sense of the results. It is therefore vital that gene products are annotated consistently, not only across all gene products within an organism, but also across similar gene products in other (often closely related) organisms. With such annotation, experimental data from many organisms can be leveraged to enable more comprehensive analyses of these large-scale datasets, and to provide biological relevance above and beyond simple phenomenological descriptions. The most comprehensive and most widely used system for organization and classification of gene products that satisfies this criterion is the Gene Ontology (GO) [40].

#### Gene Ontology at Candida Genome Database

GO annotation provides an at-a-glance summary of the most salient features of a gene product. Applied to the annotation of a large gene set, GO acts as a handle to rapidly retrieve lists of genes that share functions or roles, or whose products reside together in a common cellular location. For example, a Quick Search for "virulence" at *Candida* Genome Database (CGD, http://www.candidagenome.org/ [41]) retrieves the GO term "pathogenesis" from the Biological Process branch of the ontology, since "virulence" is included in GO as a synonym of "pathogenesis". The GO Term page at CGD displays a graphical view of the term's placement in the hierarchy, with its parental and child terms (if it has children), and also lists all of the genes that have been directly annotated with the term, along with the corresponding evidence codes, references from which the information was curated, and links to each Locus Summary page. An example GO Term Page is shown in Figure 2.

The more comprehensive the annotation of an organism's gene catalog, the easier it is to discover patterns and biological relevance in groups of genes that exhibit common properties in large-scale studies. The concise, structured, and standardized descriptions offered by GO annotation greatly facilitate the computational analysis of lists of gene products of interest. For example, a list of several dozen genes that are determined to be coregulated in a microarray experiment, or whose products are co-localized, may include genes with seemingly disparate roles, or with completely unknown roles. Analysis of the GO annotations of such a group of genes may reveal significant enrichment of particular biological processes and can therefore generate testable hypotheses, by suggesting that the uncharacterized gene products may also participate in one or more of the enriched processes. Many tools have been created to facilitate grouping and statistical analysis of gene lists based on the GO terms assigned to the genes (e.g., GO::TermFinder [42]; GO Slim Mapper, http://db.yeastgenome.org/cgi-bin/GO/goSlimMapper.pl; and numerous others listed at http://www.geneontology.org/GO.tools.shtml).

# Manual GO annotation at CGD

At CGD, GO annotation of *C. albicans* gene products is manually extracted from the scientific literature by CGD curators and added to the database, using the appropriate evidence code and reference for each annotation. The scientific literature does not typically indicate particular GO terms; rather, experimental data in a publication are used by a curator to determine the appropriate GO terms to use in annotating a gene product. Manual curation therefore requires biological expertise, as well as a working knowledge of GO itself, and the consistent application of a set of curation criteria. As of April 2009, CGD includes 5,860 manually curated GO annotations, collected from 1,176 distinct published references.

Early development of the GO focused on model organisms that are by and large nonpathogenic, such as *Saccharomyces cerevisiae* and *Drosophila melanogaster*. Beginning in 2004, a group of researchers formed an interest group called the Plant-Associated Microbe Gene Ontology group (PAMGO), to improve the parts of the GO that relate to interactions between microbes and the hosts that may be beneficial, neutral, or detrimental to either of the partner organisms (http://pamgo.vbi.vt.edu/ [43, 44]). These improvements to the GO have been used heavily in the annotation of *C. albicans* genes. For example, in CGD, over 200 genes are currently annotated to the term "symbiosis, encompassing mutualism through parasitism" and its child terms in this branch of the Biological Process ontology, which the PAMGO collaborators developed.

The C. albicans gene catalog contains a number of gene families implicated in pathogenicity, for example, agglutinin-like sequence (ALS) genes involved in adhesion to host cells, and genes coding for ferric reductases, secreted aspartyl proteases and secreted lipases [45-48]. The expansion of these gene families has likely been driven by evolutionary pressure to diversify the genes responsible for carrying out functions important for survival in the host. For example, host organisms strictly limit the amount of iron that is available to any pathogen, as an innate defense strategy against infection [49]. The microbial ferric reductases are an important component of the iron acquisition pathways that are essential for survival under the iron-limiting environment of the host [50]. As an apparent consequence of this evolutionary arms race between pathogen and host, it has been observed that the C. albicans genome contains an expanded complement of ferric reductase genes compared to its nonpathogenic cousin, S. cerevisiae [48]. As of January 2009, a total of 15 genes have been demonstrated or predicted to encode ferric reductases in C. albicans, but only 8 in S. cerevisiae (see http://www.candidagenome.org/cgi-bin/GO/go.pl?goid=293 and http:// www.yeastgenome.org/cgi-bin/GO/goTerm.pl?goid=293, respectively). Of these 15 C. albicans genes, only two have been functionally characterized by direct experimentation

[51-53]; the remaining gene functions have been inferred by similarity-based computational methods, and the experimental follow-up on these predictions is an opportunity for further study in the laboratory. As an example, the similarity of the gene orf19.7077 to ferric reductase genes has been noted, but the actual function and role of this gene has not been explored experimentally (http://www.candidagenome.org/cgi-bin/locus.pl? locus=orf19.7077, accessed on 6 April 2009).

Characterization of the genes within these families has demonstrated that individual family members can fill specialized roles and that different family members show differing regulation of expression under varying conditions [54]. For example, individual members of the family of cell surface glycoproteins encoded by the ALS genes preferentially mediate adherence to distinct ranges of host cell and extracellular matrix substrates, and even the products of a pair of allelic genes have been observed to show differential association with host cells, by virtue of differential regulation or protein sequence [55].

However, in general, not all the members of these important gene families have been experimentally characterized, and it is therefore often inferred from the family membership that all of the closely related members share the same function and role. (At this time, we curate such inferences only as they are published in the scientific literature; we do not make them *de novo*. In the future, we plan to incorporate predictions that are based on characterized protein domains.) GO annotation provides a concise way to express such inferences, by assigning a shared term that indicates the common function, and then using the GO evidence codes to clearly indicate whether the inference was based on experimental characterization or sequence similarity. However, these predictions based on family membership should be considered to be testable hypotheses about the relatively uncharacterized gene products within a gene family, as sequence similarity does not guarantee identical behavior; indeed, the cases where family members how differences are interesting biologically, and of particular relevance to *C. albicans*' pathogenesis.

# GO term transfer from S. cerevisiae to C. albicans

Because GO assignment is such a useful "handle" for genes in an annotated genome, and because only a subset of *C. albicans* genes have been characterized directly, it is both advantageous and necessary to predict functions of the uncharacterized or less-characterized genes. Predictions can be made using GO annotations in conjunction with a set of criteria for transitive term assignment, and with the use of appropriate evidence codes to provide the CGD user community with an at-a-glance indication of how these assignments were made.

The lack of a meiotic cycle, a haploid phase, and stable low-copy episomes in *C. albicans* make it more laborious to conduct genetic screens and phenotypic analyses than in *S. cerevisiae*. Direct experimental characterization of *C. albicans* gene products has therefore been concentrated in areas of virulence-related properties such as morphological switching, infectivity, and drug resistance. In contrast, *S. cerevisiae* is probably the best characterized model organism, and much is known about many cellular processes that are unlikely to ever be studied directly in *C. albicans*. In addition, annotation of the *S. cerevisiae* genome and curation of its scientific literature have been conducted for many years by the *Saccharomyces* Genome Database (SGD); indeed the Gene Ontology curation at SGD is considered the "gold standard" in the field, and 90% of known *S. cerevisiae* gene products have at least one manually assigned GO annotation (excluding annotations to "unknown" terms). Thus, there is great utility in leveraging this body of annotation, by interspecies GO term transfer from *S. cerevisiae*, to round out the annotation of the *C. albicans* gene catalog (see Figure 3).

To conduct transitive annotation at CGD, we first determined orthology relationships between C. albicans and S. cerevisiae genes using the InParanoid algorithm, which identifies reciprocal best BLAST hits between species [56]. Candidate GO annotations for transfer from S. cerevisiae to C. albicans were only those with experimental evidence in SGD, with evidence codes of either Inferred from Direct Assay (IDA), Inferred from Physical Interaction (IPI), Inferred from Genetic Interaction (IGI) or Inferred from Mutant Phenotype (IMP), as these are deemed to be the most reliable annotations. Any annotations that were themselves inferred in S. cerevisiae, either based on sequence similarity or by some other algorithm, were excluded from this group in order to avoid propagating predictions. From this candidate set of S. cerevisiae annotations, those that were either redundant with existing manually curated GO annotations in CGD, or redundant with other SGD annotations that were candidates for transfer, were removed. For example, if an annotation to "kinase activity" and an annotation to "protein kinase activity" were candidates for transfer for a particular gene product, only the more specific annotation to "protein kinase activity" was transferred, as the less specific annotation ("kinase activity") can be inferred from the annotation to its child term ("protein kinase activity"). All annotations that were transferred to CGD by this procedure were given the evidence code IEA (Inferred from Electronic Annotation), and thus identified as being computationally derived. In total, 11,191 new annotations were transferred in April 2008, affecting 3113 genes. An overview of the GO annotations in CGD, highlighting the annotations derived from S. cerevisiae annotations at SGD, is shown in Figure 4. This process is repeated periodically, to take advantage of new GO annotations at SGD, so that C. albicans researchers can continue to derive the maximum benefit from this transitive transfer.

This method of transitive annotation is not without intrinsic biases. Firstly, it is important to consider that the pool of annotations available for transfer will exhibit dependence on the organism from which term transfer is initiated, and that the types of processes that are typically studied in any given model organism will affect the well-roundedness of any set of transferred terms. In addition, some organisms simply lack genes or even entire processes that may be of great importance in others, even in the case of reasonably closely related organisms. For example, *S. cerevisiae* entirely lacks both the NADH dehydrogenase subunits of respiratory complex I and the alternative oxidase (AOX), which are present in *C. albicans* and other fungi, suggesting that *C. albicans* is more representative of other fungi in this respect [57-61]. As *S. cerevisiae* is nonpathogenic under ordinary circumstances, GO term assignments related to virulence processes are not well represented in this organism. For instance, *S. cerevisiae* completely lacks orthologs of the genes encoding the secreted lipases of *C. albicans*, a gene family for which possible roles in host colonization and in virulence have been suggested, but not yet conclusively demonstrated [47, 62, 63].

Another caveat to consider is that the accuracy of transfer of these annotations relies on correct orthology designations. We used only sequences from *C. albicans* and *S. cerevisiae* to infer orthology (with *Caenorhabditis elegans* used as an outgroup, to eliminate some false positive predictions), whereas a more comprehensive orthology mapping might use sequences from many related organisms, such as is done in the TreeFam project [64], which is used to build trees of animal genes families. In the future, we will extend our procedure to predict GO term assignments based on orthology to the fission yeast *Schizosaccharomyces pombe* and more distantly related eukaryotes for which a thorough experimental evidence-based set of GO annotation has been curated. Above all, orthology since their last common ancestor. In many, if not most cases, this assumption is likely to be correct, especially when the organisms diverged relatively recently. However, we stress that these orthology-based transferred annotations are predictions, and that subsequent experimental analysis is necessary to make a conclusive statement. Experimental follow-up on sequence-based

predictions can yield exciting and surprising results, some of which are discussed in detail below.

# **Rewiring during evolution**

C. albicans is very similar to S. cerevisiae in many ways, and early investigations into C. albicans molecular biology often emphasized the commonalities: many C. albicans genes were first cloned by complementation of S. cerevisiae mutations or by cross-hybridization with S. cerevisiae genes. More recent work has demonstrated, though, that C. albicans is not a baker's yeast that happens to possess extra abilities allowing it to establish commensal and pathogenic interactions with mammalian hosts. Rather, the molecular details of some of the most basic and essential processes have diverged between the two organisms in the approximately 140-850 million years since their evolutionary separation [36]. The elucidation of several cases of transcriptional network "rewiring" has highlighted the capacity of transcriptional networks to evolve rapidly. "Rewiring", or "reprogramming", consists of changes in membership among groups of coregulated genes, achieved through addition or removal of upstream transcription factor binding motifs, and/or substitutions in the identities of the transcription factors involved in regulation of a particular process. Thus, two different species may exhibit a similar response to a particular environmental stimulus, but the molecular cast of characters used to achieve the response may be quite different [65]. Because of the phenomenon of rewiring, it can be argued that genetic nomenclature guidelines for C. albicans should be revised (Box 1).

In perhaps the most dramatic example, the transcriptional regulatory network for genes encoding ribosomal proteins has been significantly rewired in S. cerevisiae and/or C. albicans since their last common ancestor, which is surprising given the essential nature of ribosomal protein expression. In S. cerevisiae, Rap1p, in concert with cofactors that provide specificity, binds upstream of ribosomal protein genes and activates their transcription. In contrast, the *C. albicans* ortholog of *S. cerevisiae* Rap1p is not involved in this process; rather, both in *C. albicans* and in many other Ascomycetes, this task is performed by the ortholog of the S. cerevisiae protein Tbf1p, which is likely the ancestral state [66]. In this case, both the transcription factors involved and the regulatory motifs upstream of the set of regulated genes have diverged in the S. cerevisiae lineage. In another remarkable example, the genes under mating-type control are regulated in opposite ways in the two species, but with the same outcome in terms of gene expression in the 'a' and 'alpha' mating types; furthermore, C. albicans employs a transcriptional activator in this process, Mtla2p, that has been entirely lost from the S. cerevisiae lineage [67]. Several other instances of divergence in regulatory circuits, and differing roles of orthologous transcription factors, have been uncovered [68-72].

Transcriptional regulation is not the only area in which rewiring has occurred. It has long been an apparent paradox that although the *C. albicans* genome includes orthologs of a number of *S. cerevisiae* meiotic genes [73], meiosis has never been observed. Recent work has established that genetic recombination occurs during the parasexual cycle and is mediated by *C. albicans* Spo11p, whose *S. cerevisiae* ortholog functions exclusively in meiotic recombination [14]. This raises the possibility that other *C. albicans* orthologs of meiotic genes may also have roles in the generation of genetic diversity via recombination in the parasexual cycle [14].

While these examples of rewiring do not detract from the overall utility of GO annotation transfer between species, they illustrate some limitations to the approach. The strategy depends on the presence of identifiable orthologs in both species, so it is only applicable to the common set of genes; if an ortholog has been lost from one of the species, for example

*MTLA2*, which is not present in *S. cerevisiae*, then GO annotation transfer is not possible. In addition, since rewiring is more likely to change the role of a gene product than its biochemical activity, transferred Biological Process annotations may be less reliable than Molecular Function or Cellular Component annotations. Like any GO annotations made on the basis of automated analysis, they should be treated as predictions that can be used to formulate testable hypotheses to be pursued in the laboratory.

#### Concluding remarks and future directions

Characterization of the complete gene catalog of the fungal pathogen C. albicans, although challenging, is a goal that is likely to bring exciting new insights about fungal biology and pathogenesis. Interspecies transfer of GO annotations presents an opportunity to make a large number of inferences quickly. Being able to round out the catalog of annotated genes, and, in particular, to infer annotations for genes that are unlikely ever to see experimental characterization in the organism of interest, is greatly helpful in analysis of large-scale experiments. It is important to bear in mind that GO annotations transferred on the basis of orthology are predictions and need to be further subject to experimental validation. However, in cases where experimental results do not correspond to sequence-based predictions, there is interesting biology to be explored. Comparison to S. cerevisiae genes is only the first step: there are likely to be as-yet-unrecognized C. albicans genes, which may be either not yet annotated as open reading frames, or annotated but without similarity to any currently characterized genes, that will be revealed as the genome sequence is refined and as the genes of other organisms, particularly those of other fungal pathogens, are experimentally characterized [74]. In addition, recent microarray and transcriptome sequencing studies have revealed on the order of a thousand previously unknown transcripts in S. cerevisiae [75-78], about which almost nothing is known, and many of which show little or no conservation with the corresponding syntenic regions in closely related species [76, 79]. It is expected that such studies will reveal novel genes in C. albicans, many of which are likely on the forefront of C. albicans' evolutionary arms race with its host, and intimately involved in pathogenesis. The ongoing annotation of the C. albicans genome affords opportunities to facilitate laboratory research into fungal pathogenesis (Box 2), with the exciting potential that new discoveries may unlock molecular secrets that will allow us to better tame the organism's pathogenic ways to benefit human patients suffering from Candida disease.

#### Box 1

#### Gene naming conventions and functional divergence

The phenomenon of rewiring may suggest that genetic nomenclature guidelines for *C. albicans* should be revised. The general rule has been that *C. albicans* genes should be named for their *S. cerevisiae* orthologs. However, such names can be misleading where rewiring has occurred: for example, whereas the *GAL4* gene in *S. cerevisiae* is involved in galactose metabolism, *C. albicans GAL4*) is not involved in galactose metabolism [70]. The *Candida* research community will need to decide whether priority should be placed on orthology or on biological role, when choosing gene names.

The first name used for each gene in the published literature is entered as its standard gene name in CGD (see http://www.candidagenome.org/Nomenclature.shtml). However, standard gene names can be changed; gene name requests may be initiated by contacting CGD, at candida-curator@genome.stanford.edu. The procedure for gene name change is as follows: CGD will contact each of the other research groups who have published papers concerning the gene, let them know about the name change proposal, and give everyone a chance to voice any objections or concerns. If there is consensus in support of

the change, the CGD standard name will be changed; the old name will become an alias that remains permanently associated with the gene.

#### Box

#### **Questions for future research**

- What can comparative genomics tell us about *Candida* pathogenesis genes and possible antifungal targets?
- Can we prevent the acquisition of antifungal drug resistance by *Candida* during infection of human patients?
- Can the fungus be "locked" into a commensal, avirulent state in the host?
- What are the explicit biological requirements for clinical *Candida* virulence?
- How can the host response be made more effective against systemic *Candida* infection?
- How has the relationship between *Candida* and its hosts developed over the course of evolution?

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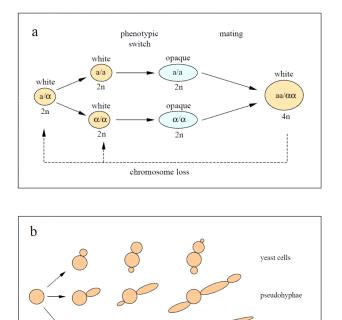
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hyphae

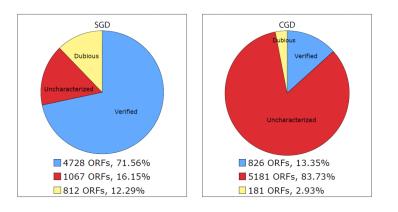
#### Figure 1.

Life cycle and morphology of *Candida albicans*. (a) *C. albicans* parasexual cycle. Diploid yeast-form cells that have become homozygous ('a/a' or ' $\alpha/\alpha'$ ) at the mating-type-like locus (MTL) may undergo a phenotypic switch from "white" to mating-competent, "opaque" cells. The mating of opaque cells of opposite mating types produces a tetraploid 'aa/ $\alpha\alpha$ ' cell that returns to the diploid state *via* chromosome loss. (b) Different shapes of *C. albicans*. Depending on the environmental conditions, *C. albicans* can grow in distinct morphological forms: round, budding yeast-like cells easily separate from each other, whereas elongated, filament-forming true hyphal and pseudohyphal cells remain attached; the constriction between cells is a distinguishing feature of pseudohyphae. Figure adapted from reference [36].

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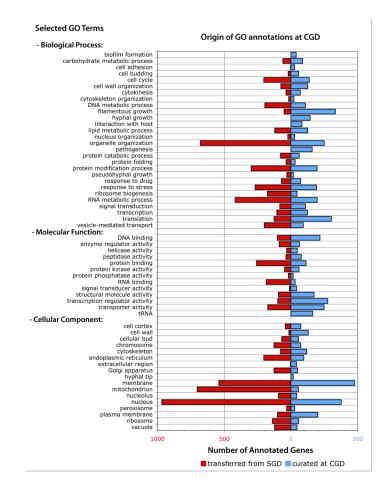
#### Figure 2.

Example GO term page for the Biological Process term "hyphal growth" from the CGD web site (http://www.candidagenome.org/cgi-bin/GO/go.pl?goid=30448, as seen on January 13, 2009). The page displays the definition of the term, with a graphic showing its location within the hierarchy. The page also contains a table that shows the number of annotations within various summary categories, including annotations made from high-throughput and computationally based experiments. A list of all of the annotated genes, along with references and evidence codes, is displayed at the bottom of the page. AmiGO is a webbased tool for searching and browsing the GO, which is provided by the Gene Ontology Consortium and is available at http://amigo.geneontology.org/cgi-bin/amigo/go.cgi. The evidence code IMP indicates that the annotation is "Inferred from Mutant Phenotype."



#### Figure 3.

Comparison of *C. albicans* and *S. cerevisiae* genome annotation. ORFs are classified as 'Verified' if there is experimental evidence for a functional gene product. 'Uncharacterized' ORFs are predicted based on sequence analysis, but currently lack experimental characterization. ORFs labeled as 'Dubious' have no experimental characterization and appear indistinguishable from random non-coding sequence.



#### Figure 4.

Statistics of GO term transfer to *C. albicans* based on *S. cerevisiae* annotation. Red bars represent the number of *C. albicans* genes at CGD annotated to the selected GO terms (annotated directly to each term itself, or annotated to one of its more specific child terms) by transferring annotations from orthologous characterized *S. cerevisiae* genes at SGD. Blue bars represent genes annotated at CGD based on published literature.