

### **RESEARCH ARTICLE**

Open Access

# Using RNA-seq to determine the transcriptional landscape and the hypoxic response of the pathogenic yeast *Candida parapsilosis*

Alessandro Guida<sup>1</sup>, Claudia Lindstädt<sup>2</sup>, Sarah L Maguire<sup>2</sup>, Chen Ding<sup>2,3</sup>, Desmond G Higgins<sup>1</sup>, Nicola J Corton<sup>4</sup>, Matthew Berriman<sup>4</sup> and Geraldine Butler<sup>2\*</sup>

#### **Abstract**

**Background:** Candida parapsilosis is one of the most common causes of Candida infection worldwide. However, the genome sequence annotation was made without experimental validation and little is known about the transcriptional landscape. The transcriptional response of *C. parapsilosis* to hypoxic (low oxygen) conditions, such as those encountered in the host, is also relatively unexplored.

**Results:** We used next generation sequencing (RNA-seq) to determine the transcriptional profile of *C. parapsilosis* growing in several conditions including different media, temperatures and oxygen concentrations. We identified 395 novel protein-coding sequences that had not previously been annotated. We removed > 300 unsupported gene models, and corrected approximately 900. We mapped the 5' and 3' UTR for thousands of genes. We also identified 422 introns, including two introns in the 3' UTR of one gene. This is the first report of 3' UTR introns in the Saccharomycotina. Comparing the introns in coding sequences with other species shows that small numbers have been gained and lost throughout evolution. Our analysis also identified a number of novel transcriptional active regions (nTARs). We used both RNA-seq and microarray analysis to determine the transcriptional profile of cells grown in normoxic and hypoxic conditions in rich media, and we showed that there was a high correlation between the approaches. We also generated a knockout of the *UPC2* transcriptional regulator, and we found that similar to *C. albicans*, Upc2 is required for conferring resistance to azole drugs, and for regulation of expression of the ergosterol pathway in hypoxia.

**Conclusion:** We provide the first detailed annotation of the *C. parapsilosis* genome, based on gene predictions and transcriptional analysis. We identified a number of novel ORFs and other transcribed regions, and detected transcripts from approximately 90% of the annotated protein coding genes. We found that the transcription factor Upc2 role has a conserved role as a major regulator of the hypoxic response in *C. parapsilosis* and *C. albicans*.

Keywords: Transcriptional profiling, pathogenesis, RNA-seq, Candida

#### Background

Candida species are the causative agents of 8-10% of hospital-acquired bloodstream infections worldwide [1]. Candida albicans remains the most common, but other species (such as Candida tropicalis, Candida parapsilosis and Candida glabrata) are increasing in frequency. C. parapsilosis is currently the second most commonly

isolated species in Latin America, and it is particularly prevalent in children less than 1 year old [2]. *C. parapsilosis* is also a frequent cause of infection in Europe [2]. Pathogenesis of *C. parapsilosis* is associated with use of indwelling medical devices and with high glucose feeds [3]. This species is often found on the hands of health care workers, and has been responsible for several outbreak infections [4-9].

Until recently, *C. parapsilosis* isolates were believed to be highly heterogeneous, and were divided into Groups I, II and III [10,11]. Group I isolates are now defined as *C.* 

Full list of author information is available at the end of the article



<sup>\*</sup> Correspondence: gbutler@ucd.ie

<sup>&</sup>lt;sup>2</sup>School of Biomolecular and Biomedical Science, Conway Institute, University College Dublin, Belfield, Dublin 4, Ireland

parapsilosis, whereas Groups II and III have been redesignated as the closely related species *C. orthopsilosis* and *C. metapsilosis* [12]. *C. parapsilosis* Group I isolates are very homogeneous, and are very difficult to distinguish using standard molecular methods such as RAPD profiling [13,14]. Sequencing the *C. parapsilosis* genome revealed that there are very few differences between the diploid chromosomes, with only one single nucleotide polymorphism (SNP) per 15,553 bases [15]. This may indicate that the species has undergone a recent population bottleneck, perhaps related to the lack of a sexual cycle, and the loss of one mating type [15-17].

The *C. parapsilosis* genome was sequenced in 2009, together with the genomes of 5 other Candida species [15]. There are currently two independent annotations of the genome. One was generated from an early assembly (consisting of 143 contigs) using an automated annotation pipeline and contains 5733 gene models, which are identified with the prefix "cpag" ([15]http://www.broad. mit.edu/annotation/genome/candida\_group/MultiHome. html). A second annotation produced by our laboratory using the same assembly characterized 5,834 gene models (including 12 mitochondrial genes), which are identified with the prefix "cpar" [18,19]. The initial annotations proved useful for large-scale comparative analysis [15,19] and for the design and application of transcriptional profiling [18,20]. However, neither the "cpag" nor "cpar" annotations included predictions of introns in any genes. Moreover, the genome sequence was also subsequently improved so that most of the current assembly consists of 8 contigs, corresponding to complete chromosomes [15]. We have now used this assembly as the basis for a new annotation of the *C. parapsilosis* genome.

We applied next-generation sequencing to explore and better define the transcriptional landscape. More than 330 million Illumina reads were generated from seven different growth conditions (including varying temperatures, media and oxygen levels). Strand-specific and long read libraries were included in the experimental design. We used these data to refine gene models, determine intron boundaries, identify nTARs and eliminate overlapping gene models lacking transcriptional support. We also used both RNA-seq and microarray analysis to determine the transcriptional response of *C. parapsilosis* to growth on rich media in hypoxic conditions, and we found a high correlation between the two approaches. Finally, we used transcriptional profiling to investigate the role of the Upc2 transcription factor as a regulator of the hypoxic response.

#### Results and discussion

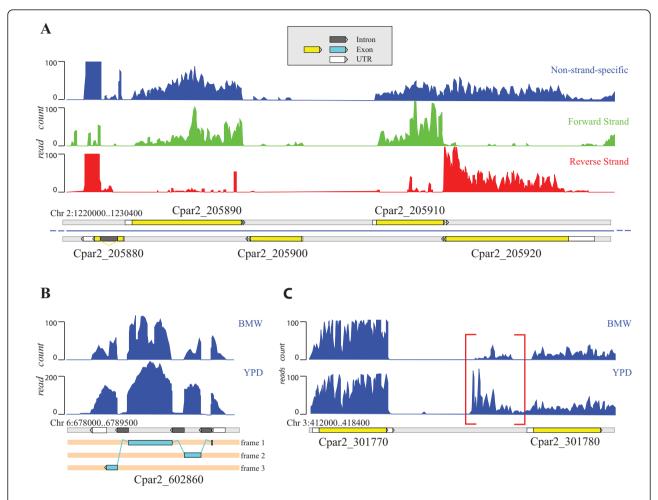
## Determining the transcriptional profile of *Candida* parapsilosis

Next-generation sequencing (Illumina) was used to determine the transcriptome of *C. parapsilosis*, and to

annotate the genome. In order to maximize coverage, we generated libraries from several conditions, including varied temperature (30°C, 37°C), media (YPD, YPglycerol, BMW, SD) and oxygen levels (21% and 1% O<sub>2</sub>) (Additional file 1). BMW media is designed to minimize growth differences between different species [21]. Strand-specific libraries were prepared from some samples grown in normoxia and hypoxia, and for a wildtype strain and a strain carrying a knockout of an ortholog of the Candida albicans UPC2 transcription factor, a major regulator of ergosterol synthesis and the hypoxic response [22-24]. Most reads were approximately 36 bases long; two long read (78 base) libraries were also generated commercially, from cells grown in YPD at 30° C. Approximately 280 million reads (including 26 million reads from the rDNA locus) were mapped to single locations in the genome using TopHat [25].

We produced a new annotation (Cpar2 prefix) by combining the RNA-seq data with the existing (cpag and cpar) annotations of the C. parapsilosis genome [15,18] and visualizing using the Artemis browser [26] (Figure 1). We identified 395 novel gene models (including 120 with introns) that were not included in the cpag annotation described in Butler et al [15,18] (Table 1, Table 2). We removed 318 overlapping gene models, and we corrected 664 by altering the position of start and stop codons, removing in-frame stop codons or identifying internal introns (Table 2). We also identified 26 pseudogenes that are well conserved with other Candida species, but the reading frames are interrupted by stop codons. In total, the Cpar2 annotation includes 5810 protein-coding genes and 91 potential tRNA genes that were predicted using tRNAscan-SE [27] (Table 1). We detected expression (FPKM, fragments per kilobase of transcript per million fragments mapped, value higher than 10) of 94% of the total protein-coding genes in the Cpar2 annotation.

To identify the boundaries of the 5' and 3' untranslated regions (UTRs) we looked for continuous read coverage (> 2 reads) that extended beyond the open reading frames. It was not always possible to correctly establish the UTR boundary, particularly where intergenic regions are small. Where possible, strand specific data was used to differentiate the UTRs of genes that are on opposite strands. We identified 5' UTRs for 4682 gene models, plus an additional 834 gene models where the predicted UTR overlaps with a neighboring annotated feature (Additional file 2). For 295 5' UTRs and 195 3' UTRs, the expression level was not high enough to analyze. Genes with long 5' UTRs (> 500 bp; 295 gene models) are enriched for regulatory GO processes (Additional file 3) suggesting that there is a correlation between long UTR regions and regulatory function. This has also been reported in C. albicans [28]. We identified



**Figure 1** Annotation of the *C. parapsilosis* genome. (A) Mapping of reads to a region of chromosome 2 (Contig005809). In the top panel, the transcribed strand is not identified. Strand-specific libraries shown below easily distinguish between the adjacent genes Cpar2\_205910 and Cpar2\_205920. Cpar2\_205880 is expressed at a higher level than the other genes in the region. It also contains a short intron. (Data is from YPD media at 30°C for both strand-specific and non-specific information, from different experiments). (B) Gene with multiple introns (Cpar2\_602860). This is an ortholog of *orf19.4193* in *C. albicans*, which also has 3 introns at equivalent positions. Intronic regions in *C. parapsilosis* are well defined by an abrupt drop in the coverage abundance. (C) Identification of a novel transcriptional active region (nTAR). Transcribed regions not associated with annotated features were designated as nTARs. One potential example, which is a homolog of the U14 small nucleolar RNA from *S. cerevisiae* (snR128), is indicated with a bracket.

3532 3' UTRs, of which 135 are longer than 500 bp. These are not enriched for any GO term. We were unable to define the 3' UTR for 2080 gene models because they overlapped with the UTR or coding region of the neighboring gene.

#### Intron Discovery

One of the main advantages of RNA-seq is that it can be used to characterize introns. TopHat [25] identifies reads that overlap a splice junction, and aligns them to either side of a canonical splice site. We manually curated each candidate predicted by TopHat by examining the overall read coverage, verifying the presence of canonical (GT/AG) splice sites, and comparing to

orthologous genes from closely related species. We found RNA-seq evidence supporting 368 novel introns, many in open reading frames not described in the cpag and cpar annotations. Most of the introns (70%) were identified from 13.8 million reads of 78 base pairs (Additional file 1); the longer reads were considerably more useful than the shorter ones. To identify introns in genes that are not expressed in the conditions we used, we compared the *C. parapsilosis* genome to gene models predicted in *C. albicans* [28-31]. We identified an additional 55 introns that are conserved between *C. albicans* and *C. parapsilosis*.

Our final annotation includes a total of 422 introns in 387 genes (Additional file 4). Whereas most lie within

Table 1 Details of the Cpar2 annotation of the *C. parapsilosis* genome

Protein coding genes	
Single-exon gene models	5423
Multi-exon gene models:	
Genes with introns in CDS only <sup>1</sup>	353
Genes with introns in UTR	34
Total protein coding genes	5810
Pseudogenes	26
Total protein-coding genes and pseudogenes	5836
tRNA genes	91
rRNA genes	4
nTARs	95
Genes with mapped 5' UTRs	4682
Genes with overlapping 5' UTRs	834
Genes with mapped 3' UTRs	3532
Genes with overlapping 3' UTRs	2087

<sup>&</sup>lt;sup>1</sup>Two genes have introns in both 5'UTR and CDS sequence.

coding sequences, 34 introns are located in 5' UTRs, and there are two in 3' UTRs. We selected a sample of eight gene models for validation by RT-PCR: one with two 3'UTR introns, two with introns in the 5' UTR, and five with introns within the coding region (Figure 2). The selected genes included orthologs of four that are known to contain introns in C. albicans, which are conserved in C. parapsilosis (Figure 2, Additional file 5). The *C. parapsilosis* orthologs of *RPL20* (Cpar2\_400980) and RPS29A (Cpar2\_205880) contain introns in the 5'UTR regions that are spliced during growth on YPD (Figure 2). These are not annotated in C. albicans. In addition, orf19.114 has no annotated intron in C. albicans, but its C. parapsilosis ortholog (Cpar2\_603230) contains an intron in the coding sequence. It is possible that many of these differences are due to errors in annotation in *C. albicans*.

The two 3' UTR introns we identified by RNA-seq are both in the same gene, Cpar2\_601470. We confirmed both by RT-PCR (Figure 2). Cpar2\_601470 is an

Table 2 Comparison of protein-coding predictions in the cpar and cpag annotations to the Cpar2 annotation

	cpar <sup>1</sup>	cpag <sup>2</sup>
Number of gene models in original set (all single-exon)	5822	5733
Unmodified in Cpar2	5195	4486
Modified in Cpar2 <sup>3</sup>	442	929
Removed in Cpar2	185	318
Additional gene models in Cpar2 <sup>3</sup>	173	395

<sup>&</sup>lt;sup>1</sup>Annotation from Rossignol et al [18]

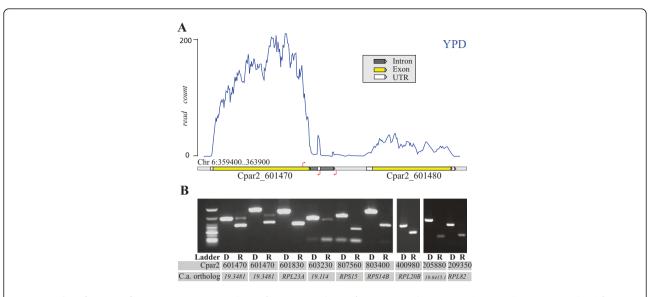
ortholog of *C. albicans orf19.3481* (gene of unknown function), which has no known introns. Although 3' UTR introns have been reported in animals and plants [32] and in fungi such as *Cryptococcus* [33], no 3' UTR introns have been identified previously in *Candida* or *Saccharomyces* species. Introns in 3' UTRs are assumed to be rare because structures after stop codons are likely to subject the mRNA to nonsense-mediated decay [33]. The 3' exons in Cpar2\_601470 are transcribed at a much lower level than the reading frame (Figure 2A), and unspliced as well as spliced products are present (Figure 2B). It is therefore possible that the 3' UTR introns are important for the regulation of expression of this gene.

The total numbers of introns are similar in *C. albicans* (431 introns in 387 genes [34]) and C. parapsilosis (422 introns in 387 genes). The 5' and 3' splice site consensus are also very similar (Additional file 6). However, the median length is smaller in C. parapsilosis (68 bp) than in C. albicans (84 bp) (Additional file 6). For many other Candida species, the genome annotations are not accurate enough to compare intron locations. Any comparative analysis is therefore restricted to genomes were introns have been predicted, or experimentally identified. For example, in C. albicans introns have been carefully validated using both experimental and predictive methods [28-31]. The genome annotations of C. dubliniensis and Debaryomyces hansenii also include predictions of a significant numbers of introns [35,36]. We therefore compared the intronic landscape of these three species with *C. parapsilosis*. Orthologous genes were identified using the Candida Gene Order Browser [19].

We found that among 4869 orthologous genes present in all four species, 425 have introns in at least one species (466 introns in total, as some genes have more than one intron) (Additional file 7). We attempted to identify introns that were gained or lost in individual species using the approach described in Zhang et al [37] (Figure 3). An intron was scored as a "gain" if it was present in only one Candida species (or lineage) (Additional file 7). An intron is assumed to be "lost" if it is present in most of the species, and missing in either a single species or a single lineage. We could not determine the evolutionary origin of most introns (247), which are conserved in all the species tested. Other cases were ambiguous, for example introns present in only the orthologs from C. dubliniensis and D. hansenii, could represent independent gains in these species, or independent losses in the others. Where possible we included outgroups such as Saccharomyces cerevisiae and Pichia pastoris [38-40] to evaluate potential intron gains. Overall, we identified at least 30 cases of intron gain, and 70 cases of intron loss. We identified 68

<sup>&</sup>lt;sup>2</sup>Annotation from Butler *et al* [15]

<sup>&</sup>lt;sup>3</sup>New and modified ORFs include the identification of 422 introns in 387 genes, listed in Additional file 4.

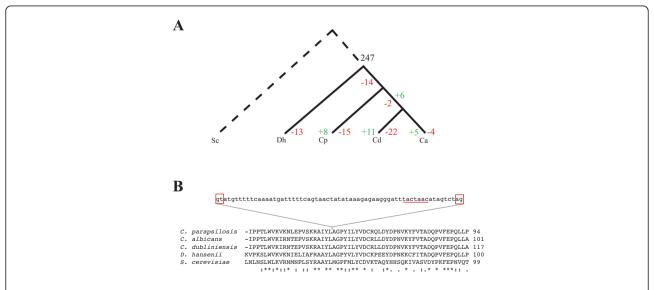


**Figure 2 Identification of introns**. (A) Non strand-specific RNA-seq (data is from YPD media at 30°C) showing the expression level for gene Cpar2\_601470. Although expression of the 3' UTR region is low, two potential introns were identified. The red arrows show the location of oligonucleotide primers designed to confirm the presence of the introns. (B) Intron validation by PCR. Pairs of oligonucleotide primers flanking the intronic region were used to amplify products from genomic DNA (D) or cDNA (R). Introns were confirmed in the 3' UTR of Cpar2\_601470, the 5' UTRs of Cpar2\_400980 and Cpar2\_205880, and within the coding sequence of 5 other genes (details of expected sizes are shown in Additional file 8). The small bands in Cpar2\_601830 and Cpar2\_807560 are likely due to the presence of excess primers or to nonspecific amplification.

introns present and 12 introns absent in *D. hansenii* genes only, which may result from intron gain/loss. However, we have not included this in Figure 3 because we are lacking well-annotated sequence information

from close relatives of *D. hansenii* and so we cannot determine when the gain/losses occurred.

We identified eight instances where introns were apparently gained in *C. parapsilosis*, and 15 examples of



**Figure 3 Analysis of intron gain and loss in** *Candida* **species.** (A) 247 introns are conserved in four *Candida* species. We used *S. cerevisiae* and other species as outgroups to try to identify introns that were lost or gained in specific lineages. Losses are indicated in red and gains in green. Dh: *D. hansenii*; Cp: *C. parapsilosis*, Cd: C. *dubliniensis*, Ca: C. *albicans*. (B) Example of an intron gain in the *C. parapsilosis* ORF, Cpar2\_502430. This intron is not present in any of the other four species.

intron loss (Additional file 7). Figure 3 shows one example of intron gain. At least 6 of these introns are also present in orthologs from C. orthopsilosis (Riccombeni et al, in preparation), and were therefore most likely gained in the common ancestor. We could not determine the presence of the remaining two in *C. orthopsilo*sis because of a lack of sequence information. In most eukaryotes, intron loss is much more common than intron gain [41-44]. However, intron gain is relatively common in the Ascomycetes [37,45]. The molecular mechanisms are still not known, and are hypothesized to include insertion of transposable elements, insertion of spliced introns from other genes into mRNA followed by reverse transcription, and genomic duplication [41]. Intron loss is most likely to occur by reverse transcription of spliced messenger mRNAs [41]. The origin of the gained introns in *C. parapsilosis* is not clear; there are no orthologous sequences elsewhere in the nuclear or mitochondrial genome.

#### Identification of novel transcribed regions

Analysis of the transcriptional profile of *C. albicans* using RNA-seq and microarrays has identified several hundred, and possibly several thousand novel transcribed regions (nTARs) that are unlikely to encode proteins [29-31]. We manually examined the C. parapsilosis data for evidence of nTARs. Because there is a wide variety in the number of novel transcribed regions identified by different methods [29-31], we used a very conservative manual approach, and counted only those C. parapsilosis regions where transcription is visually higher than background. We identified 95 regions that do not overlap with annotated ORFs (Additional file 8), and do not appear to encode proteins. We suspect that many of these regions may represent non-coding RNAs or other regulatory RNAs. In fact, some are small nuclear RNAs, such as the example shown in Figure 1C.

## Analysis of the transcriptional response of *C. parapsilosis* to hypoxia

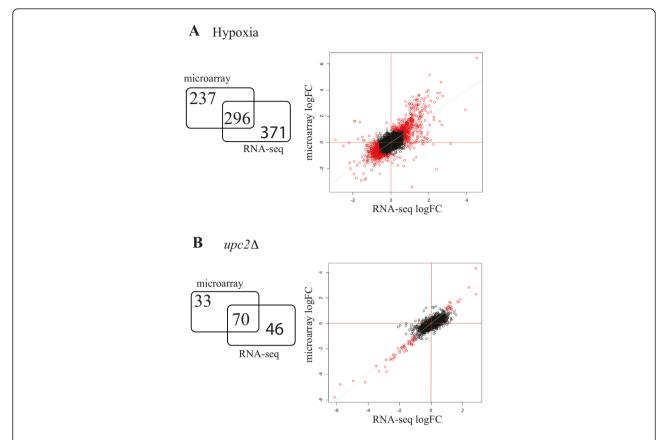
Exposure of *C. albicans* to hypoxic conditions, such as those encountered in the host during infection, results in a switch from yeast-like to hyphal growth, increased expression of genes involved in ergosterol synthesis and glycolysis, and decreased expression of genes encoding steps in the TCA cycle and in oxidative phosphorylation [46-51]. *C. parapsilosis* does not undergo true hyphal growth. However, we previously used microarray profiling to show that similar metabolic changes (i.e. increases in glycolysis and ergosterol synthesis, decreases in respiration) occur in cells exposed to low oxygen in minimal media [18]. The transcriptional profile of cells growing in hypoxia resembles that of biofilm cells for both *C. albicans* and *C. parapsilosis*, and it has been

shown that the metabolic adaptation to hypoxia is important for biofilm development by *C. albicans* [18,52-54].

We describe here the use of RNA-seq and microarray profiling to determine the transcriptional profile of C. parapsilosis cells grown in rich medium in hypoxic conditions. For the RNA-seq experiments, we observed a high correlation among six biological replicates grown in YPD in normoxia (1 > r > 0.95) and four biological replicates grown in hypoxia (0.96 > r > 0.82) (Additional file 9). Differentially expressed genes were identified by using Cufflinks, open source software specifically design to measure transcriptional differences [55]. Expression values were defined using FPKM and quantile normalization was applied.

A large number of genes are differentially expressed. Most are up-regulated in hypoxic conditions (347 genes up-regulated of 667 in total) (Additional file 10A). We identified more genes with altered expression using RNA-seq than by using microarrays [18] (667 versus 533, Additional file 10, Figure 4). However, although the microarray and RNA-seq profiling experiments were carried out at different times and by different personnel, the correlation between the two approaches is high (r = 0.73) (Figure 4). For example, we observed a high degree of overlap between the GO categories that are significantly enriched using the two approaches (Additional file 11). These include increased expression of genes involved in carbohydrate metabolism and glycolysis, fatty acid metabolism, and ergosterol biosynthesis, and decreased expression of genes involved in cellular respiration and the Tricarboxylic Acid Cycle (Additional file 11). For up-regulated genes all of the GO processes identified by microarray profiling are also present in the RNA-seq data set; some additional categories were identified in the RNA-seq profile only, including fatty acid oxidation and glucose transport (Additional file 11A). For the down-regulated genes, some categories such as amino-acid biosynthesis genes are over-represented in the microarray profiling experiments, and purine metabolism is over-represented in the RNA-seq data only. Some of the differences observed may reflect differences in experimental conditions; however, overall the two approaches produced very similar results.

The cpar2\_404850 gene has the most dramatic increase in expression in the RNA-seq (5- fold) and in the microarray profiling experiments (6.5-fold) (Additional file 10). Cpar2\_404850 has no known ortholog in other *Candida* species, no conserved domains, and no significant similarity to any other known proteins. Expression of cpar2\_404850 is similar to that of the ergosterol pathway genes (see discussion of cluster 3 below), and will be the subject of future investigation. We have previously shown that *RBT1* expression is increased during



**Figure 4 Comparison of RNA-seq and array profiling.** (A) Correlation between the RNA-seq and microarray analysis for cells grown in rich media in hypoxic conditions. (B) Correlation between the RNA-seq and microarray analysis for the comparison of the *upc2* deletion and wildtype cells grown in hypoxia. The log fold-changes of the FPKM ratio from the RNA-seq experiments is plotted on the x-axis, and the mean log fold-change from the microarray analysis is plotted on the y-axis. Each circle corresponds to a single gene; genes that are significantly differentially expressed in both microarray and RNA-seq analyses are colored in red.

growth in minimal media in hypoxic conditions, and that the gene is required for optimal biofilm formation by *C. parapsilosis* [18]; our current analyses confirms that hypoxic induction of *RBT1* also occurs during growth in rich media (Additional file 10).

In S. cerevisiae, expression of oxygen-responsive genes in controlled by monitoring the levels of heme and ergosterol [56-59]. Ergosterol synthesis genes are regulated by the paralog pair ECM22 and UPC2, which respond to sterol levels [60]. C. albicans has only one ortholog of ECM22 and UPC2 (called UPC2), and this is required for the up-regulation of ergosterol and drug resistance genes in hypoxia [22,23,51,61]. We therefore determined the effect of knocking out the ortholog of *UPC2* in *C. parapsilosis*. One allele was knocked out by replacing HIS1, and one by replacing with URA3 (Additional file 12). Knocking out UPC2 increases the sensitivity of C. parapsilosis cells to azole drugs (Figure 5), similar to the phenotype reported for C. albicans [23,61]. We used both microarrays and RNA-seq to determine the transcriptional profile of wildtype and upc2 deletion cells grown in hypoxic conditions. We identified 116 genes that are differentially expressed in the upc2 deletion grown using RNA-seq, and 103 genes using microarray profiling (Additional file13A, B). The same cell cultures were used for both experiments, and there is a high correlation between the gene expression levels identified by the two methods (r = 0.84, Figure 4B). 70 genes with differential expression were identified by both methods (Additional file 13C). GO analysis indicates that genes involved in ergosterol biosynthesis, lipid biosynthesis and response to drug have decreased expression in the upc2 deletion (Additional file 14).

To assess the importance of Upc2 as an hypoxic regulator, we used hierarchical cluster analysis to identify genes with shared expression patterns in the hypoxia/normoxia dataset and in the *upc2* deletion (Figure 5). We used the profiles generated from microarrays rather than RNA-seq for this comparison, partly because the methods are better developed, and because it allowed us to compare our results with our previously published analysis of the hypoxic response of *C. albicans* [51]. We

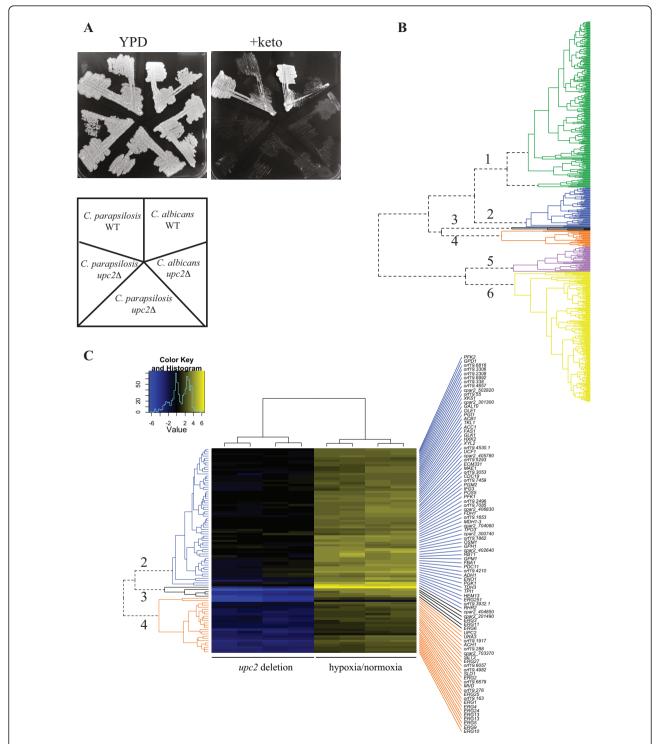


Figure 5 Analysis of the *upc2* deletion in *C. parapsilosis*. (A) Wildtype and *upc2* deletion strains of *C. albicans* and *C. parapsilosis* were grown on YPD or YPD + 0.02 mg/ml ketoconazole plates for 5 days. Deleting *UPC2* greatly increases the sensitivity of both species to ketoconazole. Strains: *C. albicans* WT (SC5314), *C. albicans upc2Δ* (TW14920), *C. parapsilosis* WT (CLIB214), and two independent knockouts of *upc2* in *C. parapsilosis* (CDupc5 and CDupc7). (B) Cluster analysis of genes differentially expressed in hypoxia and in the *upc2* deletion of *C. parapsilosis*. Details of the clusters are provided in Additional file 15. (C) Clusters 2, 3 and 4 from (B). The names of the *C. albicans* orthologs are given where available. Where there is no ortholog, the cpar2 gene name is shown.

identified six major clusters (Figure 5B, Additional file 15). Expression of genes in clusters 3 (5 genes) and 4 (25 genes) is greatly increased in wildtype cells grown in hypoxia, and is repressed in the upc2 deletion grown in the same conditions (Figure 5C). These clusters contain most of the genes required for ergosterol metabolism. Cluster 3 includes 3 genes encoding oxygen-dependent enzymes (ERG3, ERG6 and ERG11) whereas cluster 4 includes both oxygen-dependent (ERG1, ERG2, ERG4, ERG5, ERG24, ERG25, ERG27) and oxygen-independent steps (MVD, ERG9, ERG10, ERG13) (Figure 5C, Additional file 15). Genes in cluster 2 are also induced in the wildtype in hypoxia, but not in the upc2 deletion. GO analysis indicated that this cluster is enriched in processes associated with glycolysis and carbohydrate metabolism (Additional file 15B). Genes in cluster 1 are induced in hypoxia in wildtype and in the *upc2* deletion (enriched in processes associated with oxidation-reduction), and genes in cluster 6 have reduced expression in both strains (enriched in processes associated with the TCA cycle, cellular respiration and ATP synthesis). Genes in cluster 5 are more upregulated in hypoxia in the upc2 deletion, and are not enriched for any specific GO processes

Our results suggest that Upc2 in C. parapsilosis is required for induction of expression of ergosterol synthesis genes in hypoxia (clusters 3 and 4). In the absence of UPC2, expression of these genes is repressed. Deleting *UPC2* decreases the hypoxic induction of glycolytic genes (cluster 2), but not to as great an extent as the reduction in expression of the ergosterol pathway. It is therefore likely that similar to C. albicans, expression of the ergosterol pathway in *C. parapsilosis* is directly regulated by Upc2, but expression of glycolytic genes although influenced by Upc2 is likely to be controlled by other transcription factors (such as Gal4 and Tye7, as in C. albicans [46]). Upc2 does not play any role in the reduction of expression of respiratory genes in hypoxia (cluster 6) nor in the induction of genes associated with oxidation-reduction (cluster 1). The potential role of Upc2 to regulate genes in cluster 5 requires further investigation.

We did not observe a statistically significant enrichment of iron metabolism genes during hypoxic growth of *C. parapsilosis*, in either the microarray or the RNA-seq data. This differs from *C. albicans* [51]. However, expression of at least three ferric reductases (*FRE10*, *FRP1* and *CFL5*), an iron permease (*FTR1*), a multicopper oxidase and several iron-containing proteins is decreased, and expression of *HEM13*, heme oxygenase (*HMX1*) and a catalase (*CAT1*) is increased in the RNA-seq data, and for some also in the microarray data (Additional file 10). It is therefore likely that iron

metabolism genes are similarly regulated in the two species. Overall, our analyses indicate that *C. albicans* and *C. parapsilosis* have a similar response to hypoxia, and that the role of Upc2 is conserved.

#### **Conclusions**

We describe the first comprehensive annotation of the C. parapsilosis genome, which is supported by expression analysis. We identified > 300 new open reading frames and corrected the annotation of hundreds more. We also identified several nTARs, many of which are likely to represent non-coding RNAs (ncRNA). We identified two introns in the 3' UTR of a single gene, suggesting that regulated splicing may be involved in gene regulation. C. parapsilosis genes have few introns, similar to other species in the Saccharomycotina. However, we identified a small number of introns that were both gained and lost in recent evolutionary history. We also used RNA-seq and microarray profiling to identify the targets of the Upc2 transcription factor, and show that it has a major role as a regulator of ergosterol synthesis in *C. parapsilosis*.

#### **Methods**

#### Assembly

The *C. parapsilosis* genome was originally assembled as described in Butler *et al* [15] and submitted to EMBL as 24 contigs (CABE01000001-CABE01000024). Some errors and gaps have now been manually corrected, and the genome has now been assembled into 8 chromosome-sized contigs larger than 200 kb (version 012609). We have re-named the major contigs as chromosomes 1 (contig005569), 2 (contig005809), 3 (contig005806), 4 (contig006372), 5 (contig006139), 6 (contig005504), 7 (contig006110) and 8 (contig005807). The mitochondrial genome is represented by contig006121. The assembly has replaced the original submission, and is available at accession numbers HE605202-HE605210.

#### Strains and Media

The strains used in this study are listed in Additional file 16. Oligonucleotide primers used in RT-PCR and to validate constructs and introns are listed in Additional file 17. Cells were grown in YPD (1% Yeast Extract, 2% Peptone, 2% Glucose; FormediumTM), YPGlycerol (YPD with 2% glycerol instead of 2% glucose), BMW (1.5% Yeast Extract, 1% Peptone, 2% Glucose, 0.2% SC Amino Acid mix, 0.01% Adenine, 0.01% Tryptophan, 0.01% Uracil; [62,63]) and synthetic defined (SD) media (0.676% Yeast Nitrogen Base without amino acids, 2% Glucose). Cells were grown at 30°C and 21% O<sub>2</sub> unless otherwise noted. Where indicated, cells were grown in 1% oxygen, 99% nitrogen in an InVivo<sub>2</sub> 400 hypoxic chamber.

#### Generating a knockout of the C. parapsilosis UPC2 gene

Both alleles of *UPC2* were knocked out by replacement with *URA3* and *HIS1* in *C. parapsilosis CDUhis11* (Additional file 12). The *URA3* or *HIS1* disruption cassettes were generated from plasmid pLUL2 or pLHL2 [64], respectively using oligonucleotides, UPCUH\_F and UPCUH\_R (Additional file 17).

#### RNA isolation

The cells were harvested by centrifugation and either subjected to RNA extraction or frozen at -80°C. Total RNA was extracted from fresh or frozen cell pellets using a RiboPure Yeast Kit (Ambion). RNA concentrations were determined using a NanoDrop 1000 (Thermo Scientific), while quality and integrity was checked using a Bioanalyzer 2100 (Agilent Technologies).

#### Microarray analysis

The hypoxia experiments in rich media were carried out at the same time as our previous analysis of the hypoxic response in minimal media [18]. However the results were not reported previously. Overnight cultures of *C*. parapsilosis CLIB214 were subcultured in 300 ml YPD at an A<sub>600</sub> of 0.2. The culture was maintained at 30°C for 3 h at atmospheric oxygen conditions. Two aliquots were then removed after 3 h cell growth; one culture was incubated at atmospheric oxygen conditions, and the other was incubated in 1% O2 for an additional 3 h. RNA was isolated and cDNA generated and labeled with Cy3 or Cy5 as described in Rossignol et al [18]. Four biological replicates were compared: in all four the normoxic samples were labeled with Cy3 and the hypoxic samples were labeled with Cy5. To determine the transcriptional profile of the upc2 deletion, C. parapsilosis CLIB214 (wildtype) and C. parapsilosis CDupc5 (upc2 deletion) cells were grown in YPD at atmospheric oxygen for 3.5 h and then transferred to 1% O2 for an additional 2 h. Four biological replicates were used: in the first two, RNA from the wildtype strain was labeled with Cy3 and the *upc2* deletion was labeled with Cy5. cDNA was generated, labeled, and hybridized to C. parapsilosis microarrays designed and manufactured using eArray from Agilent as described in Rossignol et al [18]. The microarray platform is described on the NCBI Gene Expression Omnibus Database (GEO), with the ID GPL13192. Data were analyzed using the Limma package [65] from Bioconductor http://bioconductor.org as described in [18,51]. Only genes with a fold change (FC) greater than 2 and an adjusted p-value less than 0.05 were considered.

#### GO enrichment analysis

All the GO term enrichment analyses were performed using the web application "GO term finder" available on

the "Candida Genome Database" (CGD, http://www.candidagenome.org/cgi-bin/GO/goTermFinder). When testing *C. parapsilosis* gene lists, the *C. albicans* orthologs extracted from the Candida Gene Order Browser [19] CGOB were used, and the background for the test was appropriately adjusted by excluding those *C. albicans* genes found not to have a *C. parapsilosis* ortholog.

#### RNA-seq library preparation

Cells were grown at 30°C overnight and then diluted to an A<sub>600</sub> of 0.2, and grown for an additional 5 h at 30°C or 37°C in YPD, BMW, YPglycerol or SD media in either 21% or 1% O2 (Additional file 1). mRNA purified from total RNA using oligo dT Dynabeads (Invitrogen) was fragmented to an average size of 200 nucleotides by a 5 minute heat treatment (70°C) with a buffered zinc solution (Fragmentation Reagent, Ambion). Fragmentation of mRNA was stopped using an EDTA based Stop buffer (Ambion). Fragmented mRNA was incubated with 3 µg Random Hexamer Primers at 65°C for 5 min. First strand cDNA synthesis was carried out using 1 × First Strand Buffer (Invitrogen), 10 mM DTT, 500 µM dNTP mix (Invitrogen), 20 Units RNaseOUT and 200 units SuperScript<sup>TM</sup> II Reverse Transcriptase (Invitrogen). For strand-specific library generation, unincorporated dNTPs were subsequently removed using G-50 Micro Columns (GE Healthcare). Second strand cDNA was generated using 1× Second Strand Buffer, 300 μM dNTP mix, 2 units RNaseH, 50 units DNA Polymerase I (NEB), while a 300  $\mu$ M dUTP mix was used instead of a dNTP mix for the generation of a strand specific library. This material was used for library preparation. The method for strand-specific library preparation was adapted from Parkhomchuk et al [66] as described in Weissenmayer et al [67]. Briefly, DNA fragments were blunted in an End Repair reaction using T4 DNA Polymerase, Klenow DNA Polymerase and T4 Polynucleotide Kinase, after which a single 'A' base was added to the 3' end using dATP and Klenow Exo Fragment. Illumina adapters were ligated to the ends of the DNA fragments, allowing for the subsequent hybridization to a flow cell. Fragments of approximately 300 base pairs were purified from a 2% Agarose Gel. For the strandspecific libraries, the second strand containing uridine was removed by treatment with 1 unit Uracil N-glycosylase (UNG) in TE Buffer at 37°C for 15 min. In all cases, purified adapter ligated DNA templates were then amplified through PCR enrichment, using PCR primers (Illumina), a dNTP mix, Phusion Polymerase (NEB) and 16 cycles of PCR. All libraries were quantified using a Qubit Fluorometer (Invitrogen) and assessed on a 2% agarose gel. Amplified libraries were loaded on a flow cell. Sequencing was carried out in-house by running at least 36 cycles on an Illumina Genome Analyzer IIx

according to manufacturer's instructions, resulting in read lengths of approximately 42 bases. In addition, long reads (76 bases) were generated from two libraries by GATC Biotech AG using an Illumina Genome Analyzer IIx (Additional file 1).

#### Read mapping and expression analysis

In-house reads were processed according to version 1.4 of Illumina's Genome Analysis Pipeline. FastQ files were preprocessed by customized scripts designed to control data quality and to detect the presence of adapter sequences (data not shown). Reads from each dataset were aligned to the 8 C. parapsilosis chromosomal contigs using TopHat [25]. To minimize mapping errors and address the issue of repetitive regions, reads which mapped to more than one location or with more than 2 alignment mis-matches were discarded. TopHat was first set to detect introns with length not lower than 70 nucleotides and, secondly with length not lower than 10 nucleotides. The results were handled using SAMtools, a package of computational tools for next generation sequencing format manipulation [68]. Reads that mapped to the genome through a gapped alignment were identified and isolated. Each candidate was manually curated and discarded where necessary. Data were visualized using the Artemis genome browser [26] and Tablet, a next generation sequence assembly visualization tool [69].

The RNA-seq data was combined with the existing cpag and cpar annotations [15,18] and mapped onto the 8 chromosome contigs. Genes are named using the prefix "Cpar2". Gene models are numbered using a six-digit number; the first digit specifies the chromosome. 91 Putative tRNA genes were identified and were incorporated into the annotation using tRNAscan-SE [27].

We applied CuffDiff from the package Cufflinks [55] to identify differentially expressed genes. Cufflinks measures FPKM (fragments per kilobase of transcript per million fragments mapped); the results of the differential expression test are reported as log ratios of the FPKM values. CuffDiff incorporates data from biological repeats (listed in additional File 1). We used 4 biological replicates grown in hypoxic condition and 5 biological replicates from normoxic conditions (libraries generated with longer reads and technical replicates where not included); and 4 biological replicates from wildtype and 2 biological replicates from a upc2 deletion grown in hypoxic conditions. Quantilebased normalization was used to identify differentially expressed genes [70]. Genes with a p-value of < 0.05were considered to be differentially expressed. A Benjamini-Hochberg [71] correction for multiple-testing was also applied and genes with p-value greater then the FDR were discarded.

Some minor annotation changes were made to the genome after most of the analyses (expression analysis, UTR identification etc.) were carried out. The most upto-date annotation was submitted to EMBL, and is included in Table 1.

#### **UTR** detection

To identify the 5' and 3' UTR boundaries of protein-coding genes, we scanned the RNA-seq coverage from each experimental condition. The coverage upstream from the ATG and downstream from the stop codon of each annotated ORF was examined by an in-house program which counted the number of reads mapped at each coordinate. The longest continuous signal with at least 2 reads at each coordinate was considered. If the signal extended as far as reaching the boundary of the adjacent gene in at least one experiment, the region was considered to be "overlapping" and therefore impossible to resolve. Strand-specific data were used to map the UTRs of genes transcribed from different strands. Regions with low expression or with lack of RNA-seq evidence were discarded and marked with "no coverage". A special tag was added to those genes near the edges of the contig; in cases where the UTR signal extended to the last or first coordinate the regions was annotated as "reached end of the contig". Genes with introns in the 5' and 3' regions were manually corrected (Additional file 5).

#### nTAR identification

nTARs (novel transcriptional active regions) were identified during the manual curation of the genome. The overall expression was visualized with the Artemis genome annotation browser [26] for each biological condition. Whenever it was not possible to identify an open reading frame, or where any potential ORFs were < 100 amino acids and not conserved in other *Candida* species, we marked the location as a possible nTAR.

#### Intron loss/gain analysis

Orthologous groups of genes from four species (*C. albicans, C. dubliniensis, C. parapsilosis* and *D. hansenii*) were identified using CGOB (Maguire *et al,* in preparation) [19]. Genes containing at least one intron in one species were identified. The orthologous proteins were aligned using T-Coffee [72]. A PERL script was written to identify introns conserved in 2 or more species, defined as being within 10 amino acids in the multiple sequence alignment. Where possible, orthologous genes were identified in outgroup species including *S. cerevisiae, Pichia pastoris, Lachancea kluyveri* and *Eremothecium gossypii*. Intron gain/loss was determined by manual inspection (Additional file 7). For example, introns present in *C. albicans* and *C. dubliniensis* only were assumed to be gained on this branch, rather than

lost in all other species. For several cases it was not possible to determine if specific introns were gained or lost. We noticed that one gene in *C. dubliniensis* (CD36\_81540) and one in *D. hansenii* (DEHA2G18062g) contain putative introns that are not in the published annotations.

#### **Accession codes and Supplementary Websites**

Raw microarray data and the description of the array have been deposited in the Gene Expression Omnibus Database, under the series number GSE32716. The annotation is available from EMBL (accession no HE605202-HE605210).

#### Additional material

Additional file 1: Experimental conditions used for RNA-seq analysis. List of conditions used in RNA-seq experiments.

Additional file 2: Analysis of UTR regions in *C. parapsilosis* genes. Table showing the results of the UTR discovery analysis.

Additional file 3: GO term enrichment analysis of genes with 5'UTR longer than 500 bp. GO term enrichment analysis performed on genes with 5' UTR longer than 500 bp.

Additional file 4: Identification of introns in *C. parapsilosis*. File listing all the introns and the gene structure with corresponding coordinates.

**Additional file 5: Validation of selected introns**. The table shows the expected product sizes from genomic DNA and from cDNA, as well as information about the *C. albicans* orthologs.

Additional file 6: Intron consensus sequences and length distribution. (A) Comparison of intron length between *C. parapsilosis* and *C. albicans*. (B) Comparison of splice-site conservation between *Candida parapsilosis* and *Candida albicans*.

Additional file 7: Intron conservation in *Candida* species. Conservation of introns in four Candida genomes (*C. albicans*, *C. dubliniensis*, *C. parapsilosis* and *D. hansenii*).

Additional file 8: Identification of novel transcriptional active regions (nTARs). Transcribed regions that do not overlap with annotated ORFs and do not appear to encode proteins.

Additional file 9: Correlation between data from biological replicates for RNA-seq. (A) Heatmap plot showing the correlation of the raw FPKM from the different RNA-seq conditions. (B) Boxplot of the total FPKM values for each RNA-seq library.

Additional file 10: Genes differentially expressed in *C. parapsilosis* in normoxic versus hypoxic conditions. List of genes differentially expressed in hypoxia versus normoxia from (A) RNA-seq and (B) microarray experiment.

Additional file 11: GO term analysis of genes differentially expressed in hypoxia from RNA-seq and microarray profiling. (A) Comparison of enriched GO terms from RNA-seq and microarray profiling (B) GO terms enriched in up-regulated genes from microarrays (C) GO terms enriched in down-regulated genes from microarrays (D) GO terms enriched in down-regulated genes from RNA-seq (E) GO terms enriched in up-regulated genes from RNA-seq.

Additional file 12: Generating a gene knockout of *UPC2* in *C. parapsilosis*. Generating a gene knockout of *UPC2* in *C. parapsilosis*.

Additional file 13: Genes that are differentially regulated in a C. parapsilosis upc2 deletion in hypoxic conditions, identified by both microarrays and RNA-seq. (A) Gene found to be differentially expressed using RNA-seq (B) Genes differentially expressed using microarrays (C) Genes differentially expressed in both RNA-seq and microarray experiments.

Additional file 14: GO term enrichment analysis of genes differentially expressed in an *upc2* deletion. A) GO term enrichment analysis of genes down-regulated in an *upc2* deletion B) GO term enrichment analysis of genes up-regulated in an *upc2* deletion.

Additional file 15: Cluster analysis of genes differentially expressed in hypoxia in wildtype and in the *upc2* deletion. Hierarchical clustering of differentially expressed genes in wildtype and *upc2* deletion of *C. parapsilosis* grown in hypoxia.

**Additional file 16: Strains used in this study**. List of the strains used in this study.

**Additional file 17: Oligonucleotide primers.** List of oligonucleotide primers used in RT-PCR and to validate constructs and introns.

#### Abbreviations

CGD: Candida Genome Database; CGOB: Candida Gene Order Browser; FPKM: fragments per kilobase of transcript per million fragments mapped; GO: Gene Ontology; ncRNA: non-coding RNA; nTAR: novel transcriptional active region; ORF: open reading frame; RT: reverse transcription; snRNA: small nuclear RNA; UTR: untranslated region.

#### Acknowledgements

This work was supported by funding from Science Foundation Ireland, the Irish Research Council for Science, Engineering and Technology (IRCSET) and the Irish Health Research Board. MB and NJC were supported by the Wellcome Trust [grant WT 085775/Z/08/Z]. We are grateful to Amanda Lohan (Conway Institute) for help in carrying out the RNA-seq experiments, to Katarzyna Hooks from the University of Manchester for the analysis of ncRNAs, and to Denise Lynch for help with the manual curation of the intron annotation. We would also like to thank David Harris and other members of the Sanger Institute's sequencing and informatics teams.

#### Author details

<sup>1</sup>School of Medicine and Medical Science, Conway Institute, University College Dublin, Belfield, Dublin 4, Ireland. <sup>2</sup>School of Biomolecular and Biomedical Science, Conway Institute, University College Dublin, Belfield, Dublin 4, Ireland. <sup>3</sup>Department of Pharmacology and Cancer Biology, Duke University Medical Center, Box 3813 Research Drive, Durham, North Carolina, USA. <sup>4</sup>Pathogen Genomics Group, Wellcome Trust Sanger Institute, Cambridge, UK.

#### Authors' contributions

GB, AG and CL conceived and designed the experiments. NC and MB sequenced and assembled the genome. CL carried out the RNA-seq and microarray experiments. AG mapped and analyzed the data, with contributions from DH. SM identified tRNAs and analyzed the loss and gain of introns. CD generated the *UPC2* deletion. GB and AG wrote the paper, with contributions from CL and SM. All authors read and approved the final manuscript.

#### Competing interests

The authors declare that they have no competing interests.

Received: 25 July 2011 Accepted: 22 December 2011 Published: 22 December 2011

#### References

- Pfaller MA, Diekema DJ: Epidemiology of invasive candidiasis: a persistent public health problem. Clin Microbiol Rev 2007, 20(1):133-163.
- Pfaller MA, Castanheira M, Messer SA, Moet GJ, Jones RN: Variation in Candida spp. distribution and antifungal resistance rates among bloodstream infection isolates by patient age: report from the SENTRY Antimicrobial Surveillance Program (2008-2009). Diagn Microbiol Infect Dis 2010, 68(3):278-283.
- Trofa D, Gacser A, Nosanchuk JD: Candida parapsilosis, an emerging fungal pathogen. Clin Microbiol Rev 2008, 21(4):606-625.
- 4. Kuhn DM, Mukherjee PK, Clark TA, Pujol C, Chandra J, Hajjeh RA, Warnock DW, Soll DR, Ghannoum MA: *Candida parapsilosis*

- characterization in an outbreak setting. *Emerg Infect Dis* 2004, **10**:1074-1081.
- Clark TA, Slavinski SA, Morgan J, Lott T, Arthington-Skaggs BA, Brandt ME, Webb RM, Currier M, Flowers RH, Fridkin SK, et al: Epidemiologic and molecular characterization of an outbreak of Candida parapsilosis bloodstream infections in a community hospital. J Clin Microbiol 2004, 42(10):4468-4472.
- Welbel SF, McNeil MM, Kuykendall RJ, Lott TJ, Pramanik A, Silberman R, Oberle AD, Bland LA, Aguero S, Arduino M, et al: Candida parapsilosis bloodstream infections in neonatal intensive care unit patients: epidemiologic and laboratory confirmation of a common source outbreak. Pediatr Infect Dis J 1996, 15(11):998-1002.
- Lupetti A, Tavanti A, Davini P, Ghelardi E, Corsini V, Merusi I, Boldrini A, Campa M, Senesi S: Horizontal transmission of Candida parapsilosis candidemia in a neonatal intensive care unit. J Clin Microbiol 2002, 40(7):2363-2369.
- Diekema DJ, Messer SA, Hollis RJ, Wenzel RP, Pfaller MA: An outbreak of Candida parapsilosis prosthetic valve endocarditis. Diagn Microbiol Infect Dis 1997. 29(3):147-153.
- van Asbeck EC, Huang YC, Markham AN, Clemons KV, Stevens DA: Candida parapsilosis fungemia in neonates: genotyping results suggest healthcare workers hands as source, and review of published studies. Mycopathologia 2007, 164(6):287-293.
- Lin D, Wu LC, Rinaldi MG, Lehmann PF: Three distinct genotypes within Candida parapsilosis from clinical sources. J Clin Microbiol 1995, 33(7):1815-1821.
- Lott TJ, Kuykendall RJ, Welbel SF, Pramanik A, Lasker BA: Genomic heterogeneity in the yeast Candida parapsilosis. Curr Genet 1993, 23(5-6):463-467.
- Tavanti A, Davidson AD, Gow NA, Maiden MC, Odds FC: Candida orthopsilosis and Candida metapsilosis spp. nov. to replace Candida parapsilosis Groups II and III. J Clin Microbiol 2005, 43(1):284-292.
- Lasker BA, Butler G, Lott TJ: Molecular genotyping of Candida parapsilosis group I clinical isolates by analysis of polymorphic microsatellite markers. J Clin Microbiol 2006, 44(3):750-759.
- van Asbeck EC, Clemons KV, Markham AN, Stevens DA: Correlation of restriction fragment length polymorphism genotyping with internal transcribed spacer sequence, randomly amplified polymorphic DNA and multilocus sequence groupings for Candida parapsilosis. Mycoses 2009, 57(6):492-498
- Butler G, Rasmussen MD, Lin MF, Santos MA, Sakthikumar S, Munro CA, Rheinbay E, Grabherr M, Forche A, Reedy JL, et al: Evolution of pathogenicity and sexual reproduction in eight Candida genomes. Nature 2009, 459(7247):657-662.
- Logue ME, Wong S, Wolfe KH, Butler G: A genome sequence survey shows that the pathogenic yeast *Candida parapsilosis* has a defective MTLa1 allele at its mating type locus. Eukaryot Cell 2005, 4(6):1009-1017.
- Sai S, Holland L, McGee CF, Lynch DB, Butler G: Evolution of mating within the Candida parapsilosis species group. Eukaryot Cell 2011, 10:578-587.
- Rossignol T, Ding C, Guida A, d'Enfert C, Higgins DG, Butler G: Correlation between biofilm formation and the hypoxic response in Candida parapsilosis. Eukaryot Cell 2009, 8:550-559.
- Fitzpatrick DA, O'Gaora P, Byrne KP, Butler G: Analysis of gene evolution and metabolic pathways using the Candida Gene Order Browser. BMC Genomics 2010, 11(1):290.
- Rossignol T, Logue ME, Reynolds K, Grenon M, Lowndes NF, Butler G: Analysis of the transcriptional response of *Candida parapsilosis* following exposure to farnesol. *Antimicrob Agents Chemother* 2007, 51:2304-2312.
- Wapinski I, Pfiffner J, French C, Socha A, Thompson DA, Regev A: Gene duplication and the evolution of ribosomal protein gene regulation in yeast. Proc Natl Acad Sci USA 2010, 107(12):5505-5510.
- Oliver BG, Song JL, Choiniere JH, White TC: cis-Acting Elements within the Candida albicans ERG11 promoter mediate the azole response through transcription factor Upc2p. Eukaryot Cell 2007, 6(12):2231-2239.
- Silver PM, Oliver BG, White TC: Role of Candida albicans transcription factor Upc2p in drug resistance and sterol metabolism. Eukaryot Cell 2004, 3(6):1391-1397.
- Silva AP, Miranda IM, Guida A, Synnott J, Rocha R, Silva R, Amorim A, Pina-Vaz C, Butler G, Rodrigues AG: Transcriptional profiling of azole-resistant Candida parapsilosis strains. Antimicrob Agents Chemother 2011.

- 25. Trapnell C, Pachter L, Salzberg SL: TopHat: discovering splice junctions with RNA-Seq. Bioinformatics 2009, 25(9):1105-1111.
- Rutherford K, Parkhill J, Crook J, Horsnell T, Rice P, Rajandream MA, Barrell B: Artemis: sequence visualization and annotation. *Bioinformatics* 2000, 16(10):944-945.
- Lowe TM, Eddy SR: tRNAscan-SE: a program for improved detection of transfer RNA genes in genomic sequence. *Nucleic Acids Res* 1997, 25(5):955-964.
- Mitrovich QM, Tuch BB, Guthrie C, Johnson AD: Computational and experimental approaches double the number of known introns in the pathogenic yeast *Candida albicans*. Genome Res 2007, 17(4):492-502.
- Bruno VM, Wang Z, Marjani SL, Euskirchen GM, Martin J, Sherlock G, Snyder M: Comprehensive annotation of the transcriptome of the human fungal pathogen Candida albicans using RNA-seq. Genome Res 2010, 20(10):1451-1458.
- Tuch BB, Mitrovich QM, Homann OR, Hernday AD, Monighetti CK, De La Vega FM, Johnson AD: The transcriptomes of two heritable cell types illuminate the circuit governing their differentiation. PLoS Genet 2010, 6(8):e1001070
- 31. Sellam A, Hogues H, Askew C, Tebbji F, van Het Hoog M, Lavoie H, Kumamoto CA, Whiteway M, Nantel A: Experimental annotation of the human pathogen Candida albicans coding and noncoding transcribed regions using high-resolution tiling arrays. *Genome Biol* 2010, 11(7):R71.
- Hong X, Scofield DG, Lynch M: Intron size, abundance, and distribution within untranslated regions of genes. Mol Biol Evol 2006, 23(12):2392-2404.
- Roy SW, Penny D, Neafsey DE: Evolutionary conservation of UTR intron boundaries in Cryptococcus. Mol Biol Evol 2007, 24(5):1140-1148.
- Mitrovich QM, Tuch BB, De La Vega FM, Guthrie C, Johnson AD: Evolution of yeast noncoding RNAs reveals an alternative mechanism for widespread intron loss. Science 2010, 330(6005):838-841.
- Jackson AP, Gamble JA, Yeomans T, Moran GP, Saunders D, Harris D, Aslett M, Barrell JF, Butler G, Citiulo F, et al: Comparative genomics of the fungal pathogens Candida dubliniensis and C. albicans. Genome Res 2009, 19:2231-2244.
- Dujon B, Sherman D, Fischer G, Durrens P, Casaregola S, Lafontaine I, De Montigny J, Marck C, Neuveglise C, Talla E, et al: Genome evolution in yeasts. Nature 2004, 430(6995):35-44.
- Zhang LY, Yang YF, Niu DK: Evaluation of models of the mechanisms underlying intron loss and gain in Aspergillus fungi. J Mol Evol 2010, 71(5-6):364-373.
- Kuberl A, Schneider J, Thallinger GG, Anderl I, Wibberg D, Hajek T, Jaenicke S, Brinkrolf K, Goesmann A, Szczepanowski R, et al: High-quality genome sequence of Pichia pastoris CBS7435. J Biotechnol 2011.
- Mattanovich D, Graf A, Stadlmann J, Dragosits M, Redl A, Maurer M, Kleinheinz M, Sauer M, Altmann F, Gasser B: Genome, secretome and glucose transport highlight unique features of the protein production host *Pichia pastoris*. Microb Cell Fact 2009, 8:29.
- De Schutter K, Lin YC, Tiels P, Van Hecke A, Glinka S, Weber-Lehmann J, Rouze P, Van de Peer Y, Callewaert N: Genome sequence of the recombinant protein production host *Pichia pastoris*. Nat Biotechnol 2009, 27(6):561-566.
- 41. Roy SW, Gilbert W: The evolution of spliceosomal introns: patterns, puzzles and progress. *Nat Rev Genet* 2006, **7(3)**:211-221.
- Roy SW, Irimia M: Mystery of intron gain: new data and new models. Trends Genet 2009, 25(2):67-73.
- Stajich JE, Dietrich FS, Roy SW: Comparative genomic analysis of fungal genomes reveals intron-rich ancestors. Genome Biol 2007, 8(10):R223.
- Wilkerson MD, Ru Y, Brendel VP: Common introns within orthologous genes: software and application to plants. *Brief Bioinform* 2009, 10(6):631-644.
- 45. Nielsen CB, Friedman B, Birren B, Burge CB, Galagan JE: Patterns of intron gain and loss in fungi. *PLoS Biol* 2004, **2(12)**:e422.
- Askew C, Sellam A, Epp E, Hogues H, Mullick A, Nantel A, Whiteway M: Transcriptional regulation of carbohydrate metabolism in the human pathogen Candida albicans. PLoS Pathog 2009, 5(10):e1000612.
- Doedt T, Krishnamurthy S, Bockmuhl DP, Tebarth B, Stempel C, Russell CL, Brown AJ, Ernst JF: APSES proteins regulate morphogenesis and metabolism in Candida albicans. Mol Biol Cell 2004, 15(7):3167-3180.

- Giusani AD, Vinces M, Kumamoto CA: Invasive filamentous growth of Candida albicans is promoted by Czf1p-dependent relief of Efg1pmediated repression. Genetics 2002, 160(4):1749-1753.
- Mulhern SM, Logue ME, Butler G: The Candida albicans transcription factor Ace2 regulates metabolism and is required for filamentation in hypoxic conditions. Eukaryot Cell 2006, , 5: 2001-2013.
- Setiadi ER, Doedt T, Cottier F, Noffz C, Ernst JF: Transcriptional response of Candida albicans to hypoxia: linkage of oxygen sensing and Efg1pregulatory networks. J Mol Biol 2006, 361(3):399-411.
- Synnott JM, Guida A, Mulhern-Haughey S, Higgins DG, Butler G: Regulation of the hypoxic response in *Candida albicans*. Eukaryot Cell 2010, 9(11):1734-1746.
- Bonhomme J, Chauvel M, Goyard S, Roux P, Rossignol T, d'Enfert C: Contribution of the glycolytic flux and hypoxia adaptation to efficient biofilm formation by Candida albicans. Mol Microbiol 2011, 80(4):995-1013.
- Sellam A, Al-Niemi T, McInnerney K, Brumfield S, Nantel A, Suci PA: A
  *Candida albicans* early stage biofilm detachment event in rich medium.
  *BMC Microbiol* 2009. 9:25.
- Stichternoth C, Ernst JF: Hypoxic adaptation by Efg1 regulates biofilm formation of Candida albicans. Appl Environ Microbiol 2009, , 75: 3663-3672.
- Trapnell C, Williams BA, Pertea G, Mortazavi A, Kwan G, van Baren MJ, Salzberg SL, Wold BJ, Pachter L: Transcript assembly and quantification by RNA-Seq reveals unannotated transcripts and isoform switching during cell differentiation. Nat Biotechnol 2010. 28(5):511-515.
- Davies BS, Rine J: A role for sterol levels in oxygen sensing in Saccharomyces cerevisiae. Genetics 2006, 174(1):191-201.
- Davies BS, Wang HS, Rine J: Dual activators of the sterol biosynthetic pathway of Saccharomyces cerevisiae: similar activation/regulatory domains but different response mechanisms. Mol Cell Biol 2005, 25(16):7375-7385.
- Hickman MJ, Winston F: Heme levels switch the function of Hap1 of Saccharomyces cerevisiae between transcriptional activator and transcriptional repressor. Mol Cell Biol 2007, 27(21):7414-7424.
- 59. Zitomer RS, Lowry CV: Regulation of gene expression by oxygen in Saccharomyces cerevisiae. Microbiol Rev 1992, 56(1):1-11.
- Vik A, Rine J: Upc2p and Ecm22p, dual regulators of sterol biosynthesis in Saccharomyces cerevisiae. Mol Cell Biol 2001, 21(19):6395-6405.
- MacPherson S, Akache B, Weber S, De Deken X, Raymond M, Turcotte B: Candida albicans zinc cluster protein Upc2p confers resistance to antifungal drugs and is an activator of ergosterol biosynthetic genes. Antimicrob Agents Chemother 2005, 49(5):1745-1752.
- 62. Wapinski I, Pfiffner J, French C, Socha A, Thompson DA, Regev A: Gene duplication and the evolution of ribosomal protein gene regulation in yeast. *Proc Natl Acad Sci USA* 2010, 107(12):5505-5510.
- Rhind N, Chen Z, Yassour M, Thompson DA, Haas BJ, Habib N, Wapinski I, Roy S, Lin MF, Heiman DI, et al: Comparative Functional Genomics of the Fission Yeasts. Science 2011, 332(6032):930-936.
- Dennison PM, Ramsdale M, Manson CL, Brown AJ: Gene disruption in Candida albicans using a synthetic, codon-optimised Cre-loxP system. Fungal Genet Biol 2005, 42(9):737-748.
- Smyth GK, Speed T: Normalization of cDNA microarray data. Methods 2003, 31(4):265-273.
- Parkhomchuk D, Borodina T, Amstislavskiy V, Banaru M, Hallen L, Krobitsch S, Lehrach H, Soldatov A: Transcriptome analysis by strandspecific sequencing of complementary DNA. Nucleic Acids Res 2009, 37(18):e123.
- Weissenmayer BA, Prendergast JG, Lohan AJ, Loftus BJ: Sequencing illustrates the transcriptional response of *Legionella pneumophila* during infection and identifies seventy novel small non-coding RNAs. PLoS One 2011, 6(3):e17570.
- Li H, Handsaker B, Wysoker A, Fennell T, Ruan J, Homer N, Marth G, Abecasis G, Durbin R: The Sequence Alignment/Map format and SAMtools. Bioinformatics 2009, 25(16):2078-2079.
- Milne I, Bayer M, Cardle L, Shaw P, Stephen G, Wright F, Marshall D: Tabletnext generation sequence assembly visualization. *Bioinformatics* 2010, 26(3):401-2.
- Bullard JH, Purdom E, Hansen KD, Dudoit S: Evaluation of statistical methods for normalization and differential expression in mRNA-Seq experiments. BMC Bioinformatics 2010, 11:94.

- Benjamini Y, Hochberg Y: Controlling the false discovery rate: a practical and powerful approach to multiple testing. J R Statist Soc B 1995, 57(1):289-300.
- Notredame C, Higgins DG, Heringa J: T-Coffee: A novel method for fast and accurate multiple sequence alignment. J Mol Biol 2000, 302(1):205-217.

#### doi:10.1186/1471-2164-12-628

Cite this article as: Guida *et al.*: Using RNA-seq to determine the transcriptional landscape and the hypoxic response of the pathogenic yeast *Candida parapsilosis*. *BMC Genomics* 2011 12:628.

## Submit your next manuscript to BioMed Central and take full advantage of:

- Convenient online submission
- Thorough peer review
- No space constraints or color figure charges
- Immediate publication on acceptance
- Inclusion in PubMed, CAS, Scopus and Google Scholar
- Research which is freely available for redistribution

Submit your manuscript at www.biomedcentral.com/submit

