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Genome-wide translational response of *Candida albicans* to fluconazole treatment

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ABSTRACT Azoles are commonly used for the treatment of fungal infections, and the ability of human fungal pathogens to rapidly respond to azole treatment is critical for the development of antifungal resistance. While the roles of genetic mutations, chromosomal rearrangements, and transcriptional mechanisms in azole resistance have been well-characterized, very little is known about post-transcriptional and translational mechanisms that drive this process. In addition, most previous genome-wide studies have focused on transcriptional responses to azole treatment and likely serve as inaccurate proxies for changes in protein expression due to extensive post-transcriptional and translational regulation. In this study, we use ribosome profiling to provide the first picture of the global translational response of a major human fungal pathogen, Candida albicans, to treatment with fluconazole (Flu), one of the most widely used azole drugs. We identify sets of genes showing significantly altered translational efficiency, including genes associated with a variety of biological processes such as the cell cycle, DNA repair, cell wall/cell membrane biosynthesis, transport, signaling, DNAand RNA-binding activities, and protein synthesis. We observe both similarities and differences among the most highly represented gene categories (as defined by gene ontology) that are regulated by fluconazole at the translational vs transcriptional levels. Importantly, however, very few genes that are translationally regulated by fluconazole are also controlled transcriptionally under this condition. Our findings suggest that C. albicans possesses distinct translational mechanisms that are important for the response to antifungal treatment, which could eventually be targeted by novel antifungal therapies.

IMPORTANCE Azoles are one of the most commonly used drug classes to treat human fungal pathogens. While point mutations, chromosomal rearrangements, and transcriptional mechanisms that drive azole resistance have been well-characterized, we know very little about the role of translational mechanisms. In this study, we determined the global translational profile of genes that are expressed in the major human fungal pathogen *Candida albicans* in response to fluconazole, one of the most widely used azole drugs. We find both similarities and differences among the most highly represented categories of genes regulated by fluconazole at the transcriptional and translational levels. Interestingly, however, many of the specific genes that are regulated by fluconazole at the transcriptional mechanisms under this condition. Our results suggest that distinct *C. albicans* translational mechanisms control the response to antifungals and could eventually be targeted in the development of new therapies.

KEYWORDS fluconazole, ribosome profiling, translational control, transcriptional profiling, *Candida albicans*

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C andida albicans is the fourth leading cause of hospital-acquired bloodstream infections in the United States (1–3) and a major human fungal pathogen that is responsible for a diverse array of both systemic and mucosal infections (4–8). Cancer patients undergoing chemotherapy, recipients of artificial joints/prosthetic devices, AIDS patients, organ transplant recipients, and additional immunocompromised individuals are susceptible to acquiring a wide variety of both systemic and mucosal infections (4–8). The cost of treating patients with hospital-acquired *Candida* infections is approximately \$1 billion per year (9, 10).

Currently, only three major classes of antifungals are available to treat patients with candidiasis: azoles, echinocandins, and polyenes (11–14). Azoles, the most commonly used drug class, specifically target the ergosterol biosynthesis pathway, which is important for maintaining fungal cell membrane integrity (15). Repeated treatment of recurring *Candida* infections with antifungals, in addition to increased use of long-term antibiotic prophylaxis, has led to a significant increase in the frequency of drug-resistant clinical isolates (11–14). Antifungal resistance, and resistance to azoles in particular, is a clinically significant problem and has been classified as a serious health threat by both the Centers for Disease Control and World Health Organization (http://apps.who.int/iris/bitstream/10665/112642/1/9789241564748_eng.pdf, http://www.cdc.gov/drugresistance/threat-report-2013/pdf/ar-threats-2013-508.pdf#page=63).

Many previous studies have characterized genetic point mutations, transcriptional mechanisms, and chromosomal rearrangements that confer azole resistance in *C. albicans* and other human fungal pathogens. For example, drug-resistant isolates have shown increased transcription of *ERG11*, encoding the azole target enzyme lanosterol 14- α -demethylase, or point mutations that reduce the affinity of Erg11 for azoles (15–18). While considerably less is known about translational mechanisms that control antifungal resistance, several lines of evidence suggest that they play important roles. In the related human fungal pathogen *Candida glabrata*, Erg11 protein, but not transcript, levels were shown to be up-regulated in azole-resistant vs. susceptible isolates (19). Also in *C. glabrata*, *SSD1*, which encodes a RNA-binding protein and translational inhibitor, has recently been shown to regulate echinocandin resistance as well as expression of the Fks1 and Fks2 echinocandin target proteins (20). In addition, a previous study in *C. albicans* has shown that adaptive mistranslation of fluconazole resistance (21).

Eukaryotic 5' untranslated regions (UTRs) are known to direct translational control via upstream open reading frames as well as by formation of secondary structures, which can associate with RNA-binding proteins to inhibit ribosome accessibility and/or promote stalling; zip code sequences in 5' UTRs can also direct transcripts to translationally inactive cellular compartments (22–24). In *C. albicans*, 5' UTR-mediated translational efficiency mechanisms are known to control white-opaque switching, mating, and morphology (25–27). Several transcriptional regulators of azole resistance, including Upc2 and Fcr1, possess long (>500 bp) 5' UTR regions and could be under translational control as well (28). Finally, a comparative study has demonstrated that only about one-third of *C. albicans* proteins identified as showing differential protein expression (as determined by proteomics) in fluconazole-resistant vs susceptible isolates also showed altered transcript levels (29), suggesting that there is significant regulation at the post-transcriptional, and possibly translational, level.

Whole-genome transcriptional profiling experiments have reported significant alterations in *C. albicans* transcript levels that occur in response to treatment with azoles (30–33). Up-regulated genes included those involved in plasma membrane/cell wall synthesis/maintenance, stress responses, metabolism (including carbohydrate and lipid/ fatty acid metabolism), ergosterol biosynthesis, and drug efflux. Genes down-regulated in response to fluconazole were involved in protein synthesis and DNA synthesis/repair. However, whole-genome transcriptional profiling can often serve as an inaccurate proxy

for gene expression due to extensive changes at the post-transcriptional and translational levels.

In order to gain a better understanding of global translational changes in C. albicans gene expression, we have been using a powerful new technique, ribosome profiling (34). Through genome-wide identification of all sequences bound to ribosomes, ribosome profiling provides a comprehensive picture of the translational activity of every gene and, importantly, also serves to identify certain key translational parameters, including translational efficiency. We have recently used this approach to define the global translational profile of the C. albicans morphological transition, a key virulence trait (35). Many transporters and permeases previously demonstrated to be transcriptionally regulated in response to antifungal treatment also showed increased translational efficiency during filamentation, as well as the YCF1 ABC transporter, likely involved in multidrug resistance, and ERG251, involved in ergosterol biosynthesis (30, 35, 36). Interestingly, several genes involved in filamentation and pathogenesis known to be strongly induced at the transcriptional level showed reduced translational efficiency, suggesting that a translational fine-tuning mechanism is in place to tightly control their expression under filament-inducing conditions (35). These findings indicated that C. albicans translational expression patterns do not simply parallel transcriptional expression and highlight the importance of ribosome profiling for the identification of novel translational mechanisms. In the current study, we use ribosome profiling to examine the C. albicans genome-wide translational profile upon fluconazole treatment. We observe both similarities and differences among the most highly represented categories of genes controlled at the translational vs transcriptional levels. However, very few genes that are regulated at the translational level by fluconazole are also regulated by transcription under this condition. In addition to providing the first report of the global translational profile of a human fungal pathogen in response to antifungal treatment, this study is likely to lead to the identification of novel translational mechanisms that drive drug resistance and can be exploited for the development of new and more effective antifungal therapies.

RESULTS

Ribosome profiling of *C. albicans* cells grown in the presence and absence of fluconazole

A wild-type *C. albicans* strain was grown in the presence of 1 μ g/mL fluconazole or DMSO (a vehicle-only, no drug control) for 6 h. This concentration and exposure time were selected for our analysis because we were able to consistently observe 50% growth inhibition (IC₅₀) specifically in response to fluconazole compared to the vehicle-only control. At the 6-h time point, separate aliquots of cells were harvested for RNA-seq and Ribo-seq analysis. Ribosome profiling was performed using a protocol optimized for *C. albicans* that we have described previously (35).

A read length distribution analysis showed that the large majority of Ribo-seq reads were in the 28–31 nt range, peaking at 30 nt (Fig. S1A), which is characteristic of ribosome-protected fragments (RPFs) in *C. albicans* and other organisms (35, 37). As expected, and as previously observed for our genome-wide translational analysis of *C. albicans* morphogenesis (35), Ribo-seq and RNA-seq read counts showed a strong correlation at the genome-wide level (Fig. S1B). Metagene analysis also showed a clear 3-nucleotide periodicity in the region of the start codon specifically for RPF, but not total RNA, reads (Fig. S1C). A larger peak at the –13 position relative to the start codon indicates the P-site offset (34). As a further validation, all RPF samples showed a phase score >0.41, which is an indication of significant periodicity (35, 38). Clear groupings for all four biological replicates of fluconazole-treated and no drug Ribo-seq and RNA-seq samples were also observed in a principal component analysis (Fig. S1D). An analysis of all pairwise combinations of Ribo-seq (Fig. S2) and RNA-seq (Fig. S3) samples demonstrated a strong correlation in read counts, indicating a high degree of consistency. Overall,

these findings validated the quality of our ribosome profiling data set that was used to examine global alterations in *C. albicans* translation in response to fluconazole treatment.

Ribosome profiling reveals significant differences between the translational and transcriptional responses of *C. albicans* to fluconazole treatment

Using both Ribo-seq and RNA-seq reads, we determined alterations in translational efficiency (TE) in the presence vs absence of fluconazole for each gene in our data set. Overall, we identified 181 genes showing increased and 152 genes showing decreased TE (Fig. 1A; Table 1; Dataset S1). A high proportion of these genes exhibited large (\geq 4-fold) changes in TE (Table 1). Nearly, all genes with increased TE in response to fluconazole showed increased differential expression (DE) of Ribo-seq reads, while most genes with reduced TE showed reduced DE of Ribo-seq reads and several showed increased DE of RNA-seq reads (Fig. 1B). Example read count traces for one gene showing increased TE (*CNT*) and another gene showing reduced TE (*ARO3*) are presented in Fig. 2.

Using the set of genes with increased TE in response to fluconazole treatment, a gene ontology (GO) analysis indicated a strong representation of gene categories associated with the cell cycle, plasma membrane, mitochondrial envelope, response to drug as well as transporters, and DNA-binding activity (Fig. 3A; Dataset S2). Interestingly, many genes involved in DNA repair showed elevated TE in response to fluconazole, including RAD59, RAD32, NTG1, and MLH1 (Table 2; Dataset S1). Several membrane transporters also showed significantly increased TE, including ROA1, a PDR1-subfamily ABC transporter involved in sensitivity to azoles, the HGT4 and HGT5 glucose transporters, MRS4, a mitochondrial carrier family member involved in iron homeostasis, as well as CNT, an H⁺ nucleoside symporter. A number of genes involved in cell wall/cell membrane synthesis also demonstrated increased translation, including the BMT7 β-mannosyltransferase, OPI3 phosphatidylethanolamine N-methyltransferase, PGA1 GPI-anchored protein, ECM15, and PEX11 (Table 2; Dataset S1). Several genes associated with stress responses, including the GPI14 glycosylphosphatidylinositol- α 1,4 mannosyltransferase I catalytic subunit and TRX1 thioredoxin, involved in the response to reactive oxygen species, as well as PLC1 phosphoinositide-specific phospholipase C, also showed increased TE. Finally, several signaling molecules, such as CKA2, a catalytic subunit of protein kinase CK2, which controls the calcineurin pathway to affect fluconazole sensitivity, RAC1 G protein and RAS1 GTPase, as well as the SUT1 transcription factor, involved in sterol uptake, demonstrated elevated TE (Table 2; Dataset S1).

Among the set of genes with reduced TE in response to fluconazole, GO analysis indicated that DNA- and RNA-binding proteins showed the highest representation, followed by DNA metabolic processes, transporter activity and translation (Fig. 3A; Dataset S2). Several additional GO terms associated with protein synthesis, including ribosome biogenesis and ribosome, were also significantly represented in this gene set. Consistent with the down-regulation of protein synthesis, *RRN11*, a putative RNA polymerase I subunit; *NOP10*, a small nucleolar riboprotein; *RRP15*, a constituent of the pre-60S ribosomal particle; as well as *TIF34* and *TIF35*, putative translation initiation factors, all showed reduced TE (Dataset S1). Several genes associated with DNA

 TABLE 1
 Number of genes showing significantly altered translational efficiency and RNA differential expression during treatment of *C. albicans* with fluconazole

	>2-fold	>4-fold	>8-fold
	Iola	211010	Lo lola
Number of genes showing increased TE ^a	181	59	9
Number of genes showing reduced TE ^a	152	81	34
Number of genes showing increased RNA DE^{\flat}	337	104	28
Number of genes showing reduced RNA DE ^b	509	86	25

^{*a*}Fold changes are based on mean translational efficiency values in cells grown in YEPD + fluconazole vs YEPD + vehicle only control at 30°C at the 6-h time point, from four independent experiments (n = 4, TPM >1 in at least three replicates, $P \le 0.05$).

^bFold changes are based on mean RNA differential expression values in cells grown in YEPD + fluconazole vs YEPD + vehicle only control at 30°C at the 6-h time point, from four independent experiments (n = 4, TPM >1 in at least three replicates, $P_{adj} \le 0.05$).

Gene name ^a	Ref. no.	Description ^a	Fold change in TE ^b
RAD59	orf19.2630	Protein involved in homologous recombination and DNA break repair	7.7
RAD32	orf19.866	DNA polymerase with role in DNA repair; down-regulation associated with azole resistance	6.7
PRR2	orf19.1341	Putative serine/threonine protein kinase; mutation confers resistance to 5-flucytosine	6.4
BMT7	orf19.342	β-Mannosyltransferase; down-regulated in azole-resistant strain	6.0
SUT1	orf19.4342	Zn2-Cys6 transcription factor involved in sterol uptake	5.4
NTG1	orf19.5098	Protein with strong similarity to Saccharomyces cerevisiae DNA repair glycosylases	5.2
MLH1	orf19.4162	Putative mismatch repair protein	4.9
GPI14	orf19.2444	Catalytic subunit of glycosylphosphatidylinositol- α 1,4 mannosyltransferase, involved in GPI anchor biosynthesis; regulated under H ₂ O ₂ stress conditions	4.4
OPI3	orf19.7446	Phosphatidylethanolamine <i>N</i> -methyltransferase; down-regulation correlated with fluconazole resistance; amphotericin B, caspofungin-repressed	3.8
CSE4	orf19.6163	Centromeric histone H3 variant; depleted from centromeres under chromosome destabilizing conditions, including treatment with fluconazole	3.7
PGA1	orf19.7625	Putative GPI-anchored protein; induced in cell wall regeneration; required for adhesion to host cells	3.7
HGT4	orf19.5962	Glucose and galactose sensor; roles in fermentation, filamentation, and virulence	3.7
HGT5	orf19.6005	Putative glucose transporter of major facilitator superfamily	3.6
CKA2	orf19.3530	Catalytic a subunit of protein kinase CK2; interaction with calcineurin pathway affects fluconazole sensitivity; important for virulence in oral candidiasis model	3.5
CNT	orf19.4118	CNT family H(+) nucleoside symporter	3.5
TRX1	orf19.7611	Thioredoxin; involved in response to reactive oxygen species; amphotericin B, caspofungin repressed	3.4
ECM15	orf19.7436.1	Predicted role in cell wall organization; caspofungin repressed	3.4
PEX11	orf19.1089	Putative peroxisomal membrane protein; role in fatty acid oxidation; induced by geldamycin	3.2
ROA1	orf19.4531	Putative PDR family ABC transporter involved in sensitivity to azoles	3.1
ESP1	orf19.3356	Putative caspase-like cysteine protease; mutation confers increased sensitivity to nocodazole	2.5

TABLE 2	Selected gen	es showina	significant	v increased trans	lational efficienc	v durina 1	the <i>C. albicans</i> res	ponse to fluce	onazole treatment

^aGene names and descriptions based on *Candida* genome database annotation (http://www.candidagenome.org).

^bIndicates mean fold change in TE (n = 4, TPM >1 in at least 3 replicates, $P \le 0.05$) in cells grown in YEPD + fluconazole vs YEPD + vehicle only control at 30°C at the 6-h time point.

replication, including *DAD3*, involved in chromosome segregation and *DCC1*, important for sister chromatid cohesion, demonstrated strongly reduced TE (Table 3; Dataset S1). Genes involved in ubiquitin-mediated protein degradation, such as *UBC4* and *RTT101*, also showed significantly reduced TE. Several signaling components, including *YPD1*, a phosphohistidine intermediate, and *NIK1*, a histidine kinase that controls *C. albicans* virulence and cell wall biosynthesis, demonstrated reduced TE in response to fluconazole. Interestingly, two genes in the ergosterol biosynthesis pathway, *ERG12* and *ERG24*, also showed a reduction in TE. *MAL2*, encoding a maltose-inducible α -galactosidase, and *SLR1*, a splicing factor involved in *C. albicans* filamentous growth and virulence, were among the genes most strongly reduced in TE upon fluconazole treatment (Table 3; Dataset S1).

Because standard RNA-seq analysis is required for ribosome profiling, we were also able to re-examine the transcriptional response to fluconazole using RNA-seq, rather than DNA microarrays, which had been used in most previous studies on the response of *C. albicans* to antifungal treatment. We identified 337 genes with \geq 2-fold increased RNA DE and 509 genes with \geq 2-fold reduced RNA DE (Fig. 1C; Table 1; Dataset S1). GO analysis indicated that gene categories associated with oxidoreductase activity, plasma membrane, interspecies interaction between organisms, lipid metabolic processes, response to drug, pathogenesis, and transporter activity showed the highest representation in the set of genes with increased transcript expression (Fig. 3B; Dataset S2). As expected, and as previously observed (32, 33), a large number of genes involved in ergosterol biosynthesis were induced (*ERG1, ERG3, ERG4, ERG6, ERG7, ERG11, ERG25, ERG27, ERG251*) (Dataset S1). Two putative ABC transporters, *CDR11* and *SNQ2*, associated with drug

Gene name ^a	Ref. no.	Description ^a	Fold change in TE ^t
RBR1	orf19.535	GPI-anchored cell wall protein required for filamentous growth at acidic pH	-34.1
MAL2	orf19.7668	α-Glucosidase; maltose induced; glucose repressed	-33.2
SLR1	orf19.1750	Protein similar to mammalian SR-like RNA splicing factor; involved in filamentous growth and virulence	-19.8
HRT1	orf19.233	Component of a nuclear ubiquitin-protein ligase complex involved in cell cycle control; induced by hydroxyurea	-13.4
RRN11	orf19.718	Putative RNA polymerase I subunit	-13.3
DAD3	orf19.3871	Subunit of the Dam1 (DASH) complex, which acts in chromosome segregation by coupling kinetochores to spindle microtubules	-10.2
UBC4	orf19.7571	Ortholog(s) have protein binding, bridging, ubiquitin binding, ubiquitin-conjugating enzyme activity	-9.4
DCC1	orf19.7083	Protein with a predicted role in sister chromatid cohesion and telomere length maintenance	-9.1
GIT2	orf19.1978	Putative glycerophosphoinositol permease; fungal-specific	-8.6
YPD1	orf19.4443	Phosphohistidine intermediate protein in a phosphorelay signal transduction pathway	-8.5
FAA2	orf19.7379	Putative acyl CoA synthetase	-7.8
MNN15	orf19.753	Putative α -1,3-mannosyltransferase; predicted role in protein O-linked glycosylation	-6.5
ATP1	orf19.6854	ATP synthase alpha subunit; ciclopirox, ketoconazole, flucytosine induced; Efg1, caspofungin repressed	-5.4
CTA26	orf19.7680	Putative transcription factor/activator	-4.9
NOP10	orf19.596	Small nucleolar ribonucleoprotein; flucytosine induced	-3.7
ERG12	orf19.4809	Ortholog(s) have mevalonate kinase activity and role in ergosterol biosynthetic process	-3.7
FDH1	orf19.638	Formate dehydrogenase; oxidizes formate to CO ₂ ; induced by macrophages; fluconazole- repressed	-3.5
ERG24	orf19.1598	C-14 sterol reductase, has a role in ergosterol biosynthesis	-3.3
ZRT2	orf19.1585	Zinc transporter; ciclopirox olamine, fluconazole, alkaline repressed; transcript induced by amphotericin B; interaction with macrophages	-3.0
NIK1	orf19.5181	Histidine kinase involved in a two-component signaling pathway that regulates cell wall biosynthesis; required for wild-type virulence in mouse systemic infection	-2.9
RTT101	orf19.2440	Putative cullin subunit of E3 ubiquitin ligase complex; involved in response to DNA damage	-2.8

TABLE 3	Selected genes showing signif	ficantly reduced translational e	efficiency during the C. albica	ans response to fluconazole treatment

^aGene names and descriptions based on *Candida* genome database annotation (http://www.candidagenome.org).

^bIndicates mean fold change in TE (n = 4, TPM > 1 in at least three replicates, $P \le 0.05$) in cells grown in YEPD + fluconazole vs YEPD + vehicle only control at 30°C at the 6-h time point.

efflux, were also in this group, in addition to cell wall genes (*PGA23, ECM331, WSC1*), stress response genes (*YHB1, SOD4, CRZ1*), and several transcription factors (*UPC2, TAC1, BCR1, STP4, RIM101, RFX1, RGT1, ZCF32*) (Dataset S1). *UPC2* has previously been shown to be important for induction of ergosterol biosynthesis genes and sterol uptake (40), *TAC1* is involved in the induction of drug transporters, *BCR1* is important for azole resistance, and *STP4* is associated with the response to the echinocandin drug caspofungin. Interestingly, however, the other transcription factors (*RIM101, RFX1, RGT1*) are involved in diverse *C. albicans* processes such as alkaline-induced filamentous growth, DNA damage responses, virulence, glucose transport, and biofilm formation; to our knowledge, *RFX1* has not previously been associated with the response to antifungal treatment.

Based on our GO analysis, the set of genes down-regulated at the RNA level in response to fluconazole showed enrichment for several gene categories associated with protein synthesis, including translation, ribosome, and ribosome biogenesis (Fig. 3B; Dataset S2). Other gene categories strongly represented included plasma membrane as well as structural molecule and RNA-binding activities. We also noted that a significant number of genes involved in amino acid transport showed reduced transcript levels in response to fluconazole, including four oligopeptide transporters (*OPT1, OPT2, OPT3, OPT7*), the *GAP2* amino acid permease, and the *AAT22* aspartate aminotransferase (Dataset S1). Interestingly, two members of the *ALS* family of adhesins (*ALS2* and *ALS4*), as



FIG 1 Identification of *C. albicans* genes showing alterations in translational efficiency and RNA differential expression (DE) in response to treatment with fluconazole. (A) Volcano plot showing genes with altered TE in the presence vs absence of fluconazole. Horizontal dashed line indicates P = 0.05 cutoff. (B) Heat map of genes with alterations in TE in the presence vs absence of fluconazole as defined in part (A) and Table 1. Corresponding differential expression values from both RNA-seq (DE-RNA) and Ribo-seq (DE-Ribo) in the presence vs absence of fluconazole are shown. (C) Volcano plot showing genes with altered RNA DE in the presence vs absence of fluconazole. Horizontal dashed line indicates $p_{adj} = 0.05$ cutoff. NS = nonsignificant.

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FIG 2 Example read coverage plots for *C. albicans* genes showing differential translational efficiency in response to fluconazole treatment. Normalized Ribo-seq and RNA-seq average read coverage across four replicates are shown for *CNT* (A), which shows increased TE, and *ARO3* (B), which shows reduced TE.

well as *SSA2*, a *HSP70* family chaperone, also showed reduced transcript levels (Dataset S1). Similar, but not identical, sets of genes showed altered RNA DE in response to fluconazole in a more recent RNA-seq-based study (33).

Overall, there were both similarities and differences in the most highly represented gene categories under translational vs transcriptional control in response to fluconazole. For example, a larger fraction of cell cycle genes appears to be translationally vs transcriptionally upregulated, whereas both plasma membrane and transporter gene categories were highly represented among the sets of genes showing increased translation and transcription (Fig. 3). Interestingly, however, we observed large differences in the specific genes showing altered translation vs transcription in response to fluconazole. Of the 181 genes showing significantly increased TE, only 9 (5%) were also up-regulated at the transcriptional level and 30 (17%) were down-regulated (Dataset S1). Down-regulated genes included several involved in DNA damage repair (*RAD32, MLH1*), signaling (*RAC1, PRR2*), and translation (*RPL39, TEF1, MRP17, TIF5, ANB1*). Of the 152 genes showing significantly reduced TE, only 6 (4%) showed reduced transcription, whereas 16 (11%) showed increased transcription (including *ERG24*, involved in ergosterol biosynthesis) (Dataset S1).



FIG 3 Gene ontology analysis of genes showing changes in TE and RNA DE in response to fluconazole. (A) Genes with significant alterations in TE, as defined in Table 1, were classified by GO terms using *C. albicans* GO Slim ontology (*Candida* Genome database, http://www.candidagenome.org/) and clusterProfiler (39). (B) Genes with significant alterations in RNA DE, as defined in Table 1, were classified by GO terms as described in part (A). Count = number of genes within each GO term.

Identification of novel C. albicans transcripts showing ribosome occupancy

We have previously used ribosome profiling to identify several actively translating novel *C. albicans* genes with a recently developed bioinformatic pipeline that incorporates both RNA-seq reads and three-nucleotide periodicity of Ribo-seq reads (35). In our current study, we identified three novel *C. albicans* transcripts that did not map to known coding regions, which we have named *MSTRG.3358*, *MSTRG.10144*, and *MSTRG.4668*. The transcripts, which range from 321 to 670 bp in length and are not located immediately adjacent to known coding sequences (Dataset S3), showed strong 3-nucleotide periodicity (phase score >0.41) of RPFs but, at least initially, did not appear to contain genes based on the presence of potential stop codons. However, we cannot exclude the possibility of short open reading frames. Interestingly, all three transcripts showed a significant number of both RNA-seq and Ribo-seq read counts (Fig. 4; Dataset S3). Increased read count densities were consistently observed in these regions across all four biological replicates. In examining data for our previous ribosome profiling study on *C. albicans* morphology (35), we also consistently observed significant RNA-seq and Ribo-seq reads for these regions in all biological replicates as well. However, the read

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FIG 4 Ribosome occupancy in novel *C. albicans* transcripts. Normalized Ribo-seq and RNA-seq counts for three novel transcripts are shown in the presence and absence of fluconazole (Flu) as well as under filament-inducing (37°C + serum) vs non-inducing (30°C) conditions (data for morphology experiment are from reference (35)). Two independent biological replicates are shown for each condition.

counts do not appear to vary in fluconazole vs no drug and 37°C + serum (filaments) vs 30°C (yeast) samples (Fig. 4; Dataset S3).

DISCUSSION

While several previous studies have examined the genome-wide transcriptional response of fungal pathogens to antifungal treatment, this study is the first to examine the global translational response. We observed several similarities in the categories of genes controlled by C. albicans at both the transcriptional and translational levels. More specifically, gene categories associated with the cell wall/cell membrane and transport were highly represented in the sets of genes showing elevated translational efficiency and transcript levels (Fig. 3). In addition, gene categories associated with protein synthesis were highly represented among the sets of genes strongly down-regulated at both the translational and transcriptional levels in response to fluconazole treatment; this finding is consistent with previous studies indicating a widespread reduction in protein synthesis following antifungal treatment (32, 33) and is most likely part of a general stress response. However, there were also significant differences in translational vs transcriptional regulation of specific gene categories. For example, genes associated with the cell cycle and DNA damage repair were more highly represented in the increased TE vs RNA DE group (Fig. 3). In addition, genes associated with DNA-binding proteins and DNA metabolic processes were more highly represented in the reduced TE vs RNA DE group. Differences in translational vs transcriptional regulation in response to

fluconazole treatment became more apparent at the level of specific genes. Strikingly, only a very small fraction of genes showing an increase or decrease in TE also showed a similar change in transcription. In fact, a significantly larger number of genes with increased TE showed reduced RNA DE and vice versa. These findings are consistent with our previous observations (35) and suggest that the *C. albicans* response to fluconazole is under widespread translational control that does not simply parallel the transcriptional response.

Our analysis has shown that a variety of genes involved in processes previously associated with the response to fluconazole are specifically up-regulated at the translational, but not transcriptional, level. These genes include the ROA1 PDR-subfamily ABC transporter as well as several genes involved in cell wall/cell membrane synthesis (BMT7, OPI1, PGA1, ECM15, PEX11) and stress responses (GPI14, TRX1, PLC1). Interestingly, down-regulation of transcript levels for several of these genes, including BMT7 and OPI3, was correlated with fluconazole resistance (41, 42). TRX1 and ECM15 transcripts were also repressed in response to treatment with other antifungals (30). In these cases, translational up-regulation may serve to fine tune protein levels for an optimal response to drug treatment. These findings are also consistent with our observations that transcriptional gene expression patterns do not necessarily parallel translational patterns with respect to antifungal treatment. Translational up-regulation of genes associated with DNA repair may be part of a larger response to cellular stresses, which can include DNA-damaging agents. Interestingly, in addition to the ROA1 drug transporter, we also observed increased translation of two glucose transporters, as well as a mitochondrial membrane transporter important for iron homeostasis. These findings suggest that C. albicans uses specific translational mechanisms to promote the acquisition of key nutrients under drug stress conditions. Altered translation of multiple signaling molecules (RAC1, RAS, YPD1, NIK1) also suggests that specific translational mechanisms control signal transduction pathways that may be part of the response to fluconazole.

Overall, our RNA-seq analysis identified significantly fewer C. albicans genes showing altered transcription in response to fluconazole compared to a previous DNA microarraybased study (32). In addition to the method of analysis (RNA-seq vs DNA microarray), these discrepancies could be attributed to differences in fluconazole concentration, exposure time, growth medium, as well as statistical cut-offs that were used. Both the Lepak et al. study (32) and our current study show that genes associated with cell membrane/cell wall and stress responses are up-regulated and genes associated with protein synthesis are down-regulated at the transcriptional level. However, as expected for RNA-seq, our study identified additional genes associated with these processes that were not previously identified in the Lepak et al. study (32). We also show that several transcription factors are transcriptionally induced in response to fluconazole, and two members of the ALS adhesin gene family are transcriptionally down-regulated. These findings, which are mostly consistent with those of a more recent RNA-seq study (33), suggest that additional regulatory pathways and processes are associated with the transcriptional response to drug treatment. Multiple genes associated with amino acid transport, including oligopeptide transporters, also showed significant transcriptional down-regulation in response to fluconazole, which is consistent with our current observation and previous observations of a strong reduction in protein synthesis (32, 33). Finally, similar to previous studies (30-33), we observed transcriptional induction of many genes important for ergosterol biosynthesis. Interestingly, two genes in this pathway (ERG12, ERG24) showed reduced TE, one of which was also induced at the transcriptional level. These findings suggest the presence of novel translational mechanisms that may be specifically responsible for regulating ergosterol biosynthesis in response to fluconazole treatment. Overall, our study suggests that the response of C. albicans, and most likely additional human fungal pathogens, to antifungal treatment is under widespread translational control that does not necessarily parallel known transcriptional mechanisms. Ultimately, components of several of these translational mechanisms may serve as targets for the development of novel antifungal therapies.

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Our identification of novel transcribed regions of the *C. albicans* genome with strong ribosome occupancy and 3-nucleotide periodicity suggests that they encode proteins. Initially, this conclusion seemed paradoxical given that these transcripts contain a significant number of stop codons. However, a previous ribosome profiling study made a very similar observation with respect to certain *linc* RNAs in mice (43). Using harringtonine as a protein synthesis inhibitor to accurately map specific translation start sites, the authors demonstrated that these RNAs were polycistronic, with multiple small coding sequences. While our current study did not use harringtonine, polycistronic mRNAs appear to represent a viable explanation. Additional ribosome profiling studies, which are able to determine translation start sites with greater accuracy, could be performed in the future to test this intriguing hypothesis.

MATERIALS AND METHODS

Candida albicans strain and growth conditions

For ribosome profiling experiments, a saturated overnight culture of *C. albicans* wild-type strain SC5314 was grown in YEPD (yeast extract - peptone - dextrose) medium at 30°C and 200 rpm. The culture was diluted in 50-mL YEPD medium and incubated until reaching an OD₆₀₀ of 1.0. The culture was further diluted to an OD₆₀₀ of 0.025 in 400-mL fresh YEPD and grown to OD₆₀₀ = 0.050. At this point, 200 mL of culture was transferred to two 1-L flasks. Fluconazole was added to one flask at 1 µg/mL, and an equivalent volume of DMSO was added to the second flask as a vehicle-only control. Both flasks were incubated at 30°C for 6 h, which we had previously determined as the fluconazole IC₅₀. To confirm that a 50% reduction in cell count occurred due to fluconazole treatment, OD₆₀₀ of both cultures was measured and compared.

Cell extract preparation and ribosome profiling

Cells were recovered by filtration at room temperature, rapidly scraped off the filter paper with a cell scraper, placed into ice-cold lysis buffer (1× Yeast polysome buffer (Illumina), 10% Triton X-100 (Sigma), 10 mg/mL GMPPNP (Sigma), 10 mg/mL Blasticidin S (Invivogen)) and homogeneously mixed, followed by snap freezing in liquid nitrogen. Cell lysates were prepared, and ribosome profiling was performed using four biological replicates as we have described previously (35).

Ribo-seq and RNA-seq data analysis

Assessment of read quality, adapter trimming, GO analysis, as well as identification of novel ORFs and genes showing altered RNA DE and TE were performed as previously described (35). TrimGalore (v 0.4.3) (44) was used to trim adaptor and low-quality (phred quality score <5) score bases and retained reads were at least 20 nucleotides long for both RNA-seq and Ribo-seq libraries. To map the trimmed reads, we used STAR (v2.5.2b) (45). We allowed each alignment to have a maximum of two mismatched bases. Reads were first aligned to non-mRNA reference (C_albicans_SC5314_version_A22-s07m01-r27 other features no introns.fasta) obtained from Candida genome database, (http://www.candidagenome.org/). The unmapped reads to the non-mRNA reference were then mapped to Assembly 22 reference using GTF s07-m01-r27 as the guiding annotation. For both Ribo-seg and RNA-seg libraries, we performed gene-level counting using featureCounts (v1.6.4) (46). To account for the diploid C. albicans Assembly 22, we first counted reads for each allele separately and then took their sum as the input for differential expression and translational efficiency analysis. Ribotricer (v1.3.2) (38) was used to perform periodicity analysis of the Ribo-seq data. We defined an "ORF" as any sequence with a start codon differing from AUG by at most one nucleotide as well as possessing an in-frame stop codon and then used ribotricer to generate a periodicty score for each of these ORFs. An ORF was annotated to be "translating" if it displayed a phase score >0.41. DESeq2 (v1.38.0) (47) was used to perform DE analysis of the RNA-seq

data. We defined genes to be differentially expressed if their absolute \log_2 fold-change was at least 1 with an FDR-adjusted *P*-value of at least 0.05 as long as the associated transcripts per million (TPM) was >1 in at least three out of four biological replicates. To perform differential TE analysis, we used riborex (v2.4.0) (48) using only genes that had at least one read count per replicate across both fluconazole-treated and no drug Ribo-seq and RNA-seq samples. Genes were defined to be showing differential TE if their TPM was greater than 1 in at least three out of four biological replicates and their absolute fold-change on a \log_2 scale was at least 1 with a corresponding non-adjusted *P*-value of at least 0.05. To perform GO analyses, we used clusterProfiler (v4.3.0) (39), using the GO slim ontology file available from *Candida* Genome database, (http://www.candidagenome.org/). Genes used for GO analysis showed a TPM > 1 in at least three out of four biological replicates.

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AUTHOR CONTRIBUTIONS

Saket Choudhary, Conceptualization, Data curation, Formal analysis, Investigation, Methodology, Software, Validation, Visualization, Writing – review and editing | Vasanthakrishna Mundodi, Investigation, Methodology, Writing – review and editing | Andrew D. Smith, Formal analysis, Investigation, Project administration, Software, Supervision, Writing – review and editing | David Kadosh, Conceptualization, Formal analysis, Funding acquisition, Project administration, Resources, Supervision, Writing – original draft, Writing – review and editing

DATA AVAILABILITY

All raw and processed Ribo-seq and RNA-seq data from this study are available at the NCBI Gene Expression Omnibus (GEO) database under accession number GSE227590. Custom scripts used to generate the manuscript data are available at Github.

ADDITIONAL FILES

The following material is available online.

Supplemental Material

Dataset S1 (Spectrum02572-23-s0001.xlsx). RNA differential gene expression (DE) and translational efficiency (TE) data for *C. albicans* cells grown in the presence vs absence of fluconazole.

Dataset S2 (Spectrum02572-23-s0002.xlsx). Gene Ontology (GO) data for *C. albicans* genes showing altered RNA differential gene expression (DE) and translational efficiency (TE) in response to treatment with fluconazole.

Dataset S3 (Spectrum02572-23-s0003.xlsx). TPM counts for novel *C. albicans* transcribed regions showing ribosome occupancy.

Supplemental material (Spectrum02572-23-s0004.pdf). Supplemental Figures S1 to S3.

REFERENCES

- Sobel JD. 2007. Vulvovaginal candidosis. Lancet 369:1961–1971. https:// doi.org/10.1016/S0140-6736(07)60917-9
- Edmond MB, Wallace SE, McClish DK, Pfaller MA, Jones RN, Wenzel RP. 1999. Nosocomial bloodstream infections in United States hospitals: a three-year analysis. Clin Infect Dis 29:239–244. https://doi.org/10.1086/ 520192
- Wisplinghoff H, Bischoff T, Tallent SM, Seifert H, Wenzel RP, Edmond MB. 2004. Nosocomial bloodstream infections in US hospitals: analysis of 24,179 cases from a prospective nationwide surveillance study. Clin Infect Dis 39:309–317. https://doi.org/10.1086/421946
- 4. Odds FC. 1988. *Candida* and Candidosis, 2nd ed. Baillière Tindall, London.
- Odds FC. 1994. Pathogenesis of Candida infections. J Am Acad Dermatol 31:S2–S5. https://doi.org/10.1016/s0190-9622(08)81257-1
- Dupont PF. 1995. Candida albicans, the opportunist. a cellular and molecular perspective. J Am Podiatr Med Assoc 85:104–115. https://doi. org/10.7547/87507315-85-2-104
- Weig M, Gross U, Mühlschlegel F. 1998. Clinical aspects and pathogenesis of *Candida* infection. Trends Microbiol 6:468–470. https://doi.org/10. 1016/s0966-842x(98)01407-3
- Shepherd MG, Poulter RT, Sullivan PA. 1985. Candida albicans: biology, genetics, and pathogenicity. Annu Rev Microbiol 39:579–614. https:// doi.org/10.1146/annurev.mi.39.100185.003051
- Revie NM, Iyer KR, Robbins N, Cowen LE. 2018. Antifungal drug resistance: evolution, mechanisms and impact. Curr Opin Microbiol 45:70–76. https://doi.org/10.1016/j.mib.2018.02.005
- Miller LG, Hajjeh RA, Edwards JE. 2001. Estimating the cost of nosocomial candidemia in the United States. Clin Infect Dis 32:1110. https://doi.org/ 10.1086/319613
- Sanglard D, Odds FC. 2002. Resistance of *Candida* species to antifungal agents: molecular mechanisms and clinical consequences. Lancet Infect Dis 2:73–85. https://doi.org/10.1016/s1473-3099(02)00181-0
- 12. Parker JE, Warrilow AGS, Price CL, Mullins JGL, Kelly DE, Kelly SL. 2014. Resistance to antifungals that target CYP51. J Chem Biol 7:143–161. https://doi.org/10.1007/s12154-014-0121-1
- Sanguinetti M, Posteraro B, Lass-Flörl C. 2015. Antifungal drug resistance among *Candida* species: mechanisms and clinical impact. Mycoses 58 Suppl 2:2–13. https://doi.org/10.1111/myc.12330
- Pfaller MA. 2012. Antifungal drug resistance: mechanisms, epidemiology, and consequences for treatment. Am J Med 125:S3–13. https://doi.org/ 10.1016/j.amjmed.2011.11.001

- Shapiro RS, Robbins N, Cowen LE. 2011. Regulatory circuitry governing fungal development, drug resistance, and disease. Microbiol Mol Biol Rev 75:213–267. https://doi.org/10.1128/MMBR.00045-10
- Nishimoto AT, Sharma C, Rogers PD. 2020. Molecular and genetic basis of azole antifungal resistance in the opportunistic pathogenic fungus *Candida albicans*. J Antimicrob Chemother 75:257–270. https://doi.org/ 10.1093/jac/dkz400
- Chowdhary A, Sharma C, Meis JF. 2017. Candida auris: a rapidly emerging cause of hospital-acquired multidrug-resistant fungal infections globally. PLoS Pathog 13:e1006290. https://doi.org/10.1371/ journal.ppat.1006290
- Arastehfar A, Gabaldón T, Garcia-Rubio R, Jenks JD, Hoenigl M, Salzer HJF, Ilkit M, Lass-Flörl C, Perlin DS. 2020. Drug-resistant fungi: an emerging challenge threatening our limited antifungal armamentarium. Antibiotics (Basel) 9:877. https://doi.org/10.3390/antibiotics9120877
- Rogers PD, Vermitsky JP, Edlind TD, Hilliard GM. 2006. Proteomic analysis of experimentally induced azole resistance in *Candida glabrata*. J Antimicrob Chemother 58:434–438. https://doi.org/10.1093/jac/dkl221
- Healey KR, Paderu P, Hou X, Jimenez Ortigosa C, Bagley N, Patel B, Zhao Y, Perlin DS. 2020. Differential regulation of echinocandin targets Fks1 and Fks2 in *Candida glabrata* by the post-transcriptional regulator Ssd1. J Fungi (Basel) 6:143. https://doi.org/10.3390/jof6030143
- Weil T, Santamaría R, Lee W, Rung J, Tocci N, Abbey D, Bezerra AR, Carreto L, Moura GR, Bayés M, Gut IG, Csikasz-Nagy A, Cavalieri D, Berman J, Santos MAS. 2017. Adaptive mistranslation accelerates the evolution of fluconazole resistance and induces major genomic and gene expression alterations in *Candida albicans*. mSphere 2:e00167-17. https://doi.org/10.1128/mSphere.00167-17
- Mignone F, Gissi C, Liuni S, Pesole G. 2002. Untranslated regions of mRNAs. Genome Biol 3:REVIEWS0004. https://doi.org/10.1186/gb-2002-3-3-reviews0004
- Pickering BM, Willis AE. 2005. The implications of structured 5' untranslated regions on translation and disease. Semin Cell Dev Biol 16:39–47. https://doi.org/10.1016/j.semcdb.2004.11.006
- Adeli K. 2011. Translational control mechanisms in metabolic regulation: critical role of RNA binding proteins, microRNAs, and cytoplasmic RNA granules. Am J Physiol Endocrinol Metab 301:E1051–64. https://doi.org/ 10.1152/ajpendo.00399.2011
- Desai PR, Lengeler K, Kapitan M, Janßen SM, Alepuz P, Jacobsen ID, Ernst JF. 2018. The 5' untranslated region of the *Efg1* transcript promotes its translation to regulate hyphal morphogenesis in *Candida Albicans*. mSphere 3:e00280-18. https://doi.org/10.1128/mSphere.00280-18

- Guan Z, Liu H. 2015. The WOR1 5' untranslated region regulates whiteopaque switching in *Candida albicans* by reducing translational efficiency. Mol Microbiol 97:125–138. https://doi.org/10.1111/mmi. 13014
- Childers DS, Mundodi V, Banerjee M, Kadosh D. 2014. A 5' UTR-mediated translational efficiency mechanism inhibits the *Candida albicans* morphological transition. Mol Microbiol 92:570–585. https://doi.org/10. 1111/mmi.12576
- Bruno VM, Wang Z, Marjani SL, Euskirchen GM, Martin J, Sherlock G, Snyder M. 2010. Comprehensive annotation of the transcriptome of the human fungal pathogen *Candida albicans* using RNA-seq. Genome Res 20:1451–1458. https://doi.org/10.1101/gr.109553.110
- Yan L, Zhang JD, Cao YB, Gao PH, Jiang YY. 2007. Proteomic analysis reveals a metabolism shift in a laboratory fluconazole-resistant *Candida albicans* strain. J Proteome Res 6:2248–2256. https://doi.org/10.1021/ pr060656c
- Liu TT, Lee REB, Barker KS, Lee RE, Wei L, Homayouni R, Rogers PD. 2005. Genome-wide expression profiling of the response to azole, polyene, echinocandin, and pyrimidine antifungal agents in *Candida albicans*. Antimicrob Agents Chemother 49:2226–2236. https://doi.org/10.1128/ AAC.49.6.2226-2236.2005
- De Backer MD, Ilyina T, Ma XJ, Vandoninck S, Luyten WH, Vanden Bossche H. 2001. Genomic profiling of the response of *Candida albicans* to itraconazole treatment using a DNA microarray. Antimicrob Agents Chemother 45:1660–1670. https://doi.org/10.1128/AAC.45.6.1660-1670. 2001
- Lepak A, Nett J, Lincoln L, Marchillo K, Andes D. 2006. Time course of microbiologic outcome and gene expression in *Candida albicans* during and following *in vitro* and *in vivo* exposure to fluconazole. Antimicrob Agents Chemother 50:1311–1319. https://doi.org/10.1128/AAC.50.4. 1311-1319.2006
- Hunsaker EW, Yu C-H, Franz KJ. 2021. Copper availability influences the transcriptomic response of *Candida albicans* to fluconazole stress. G3 (Bethesda) 11:jkab065. https://doi.org/10.1093/g3journal/jkab065
- Ingolia NT, Ghaemmaghami S, Newman JRS, Weissman JS. 2009. Genome-wide analysis *in vivo* of translation with nucleotide resolution using ribosome profiling. Science 324:218–223. https://doi.org/10.1126/ science.1168978
- Mundodi V, Choudhary S, Smith AD, Kadosh D, Dudley A. 2021. Global translational landscape of the *Candida albicans* morphological transition. G3 (Bethesda) 11:jkaa043. https://doi.org/10.1093/g3journal/ jkaa043
- Gaur M, Choudhury D, Prasad R. 2005. Complete inventory of ABC proteins in human pathogenic yeast, *Candida albicans*. J Mol Microbiol Biotechnol 9:3–15. https://doi.org/10.1159/000088141
- Wolin SL, Walter P. 1988. Ribosome pausing and stacking during translation of a eukaryotic mRNA. EMBO J 7:3559–3569. https://doi.org/ 10.1002/j.1460-2075.1988.tb03233.x

- Choudhary S, Li W, D Smith A. 2020. Accurate detection of short and long active ORFs using Ribo-seq data. Bioinformatics 36:2053–2059. https://doi.org/10.1093/bioinformatics/btz878
- Yu G, Wang LG, Han Y, He QY. 2012. clusterProfiler: an R package for comparing biological themes among gene clusters. OMICS 16:284–287. https://doi.org/10.1089/omi.2011.0118
- Silver PM, Oliver BG, White TC. 2004. Role of *Candida albicans* transcription factor Upc2p in drug resistance and sterol metabolism. Eukaryot Cell 3:1391–1397. https://doi.org/10.1128/EC.3.6.1391-1397. 2004
- Rogers PD, Barker KS. 2003. Genome-wide expression profile analysis reveals coordinately regulated genes associated with stepwise acquisition of azole resistance in *Candida albicans* clinical isolates. Antimicrob Agents Chemother 47:1220–1227. https://doi.org/10.1128/ AAC.47.4.1220-1227.2003
- 42. Karababa M, Coste AT, Rognon B, Bille J, Sanglard D. 2004. Comparison of gene expression profiles of *Candida albicans* azole-resistant clinical isolates and laboratory strains exposed to drugs inducing multidrug transporters. Antimicrob Agents Chemother 48:3064–3079. https://doi. org/10.1128/AAC.48.8.3064-3079.2004
- Ingolia NT, Lareau LF, Weissman JS. 2011. Ribosome profiling of mouse embryonic stem cells reveals the complexity and dynamics of mammalian proteomes. Cell 147:789–802. https://doi.org/10.1016/j.cell.2011.10.002
- 44. Krueger F. 2012. Trim Galore: a wrapper tool around Cutadapt and FastQC to consistently apply quality and adapter trimming to FastQ files, with some extra functionality for Mspl-digested RRBS-type (Reduced Representation Bisufite-Seq) libraries. http://www.bioinformatics. babraham.ac.uk/projects/trim_galore.
- Dobin A, Davis CA, Schlesinger F, Drenkow J, Zaleski C, Jha S, Batut P, Chaisson M, Gingeras TR. 2013. STAR: ultrafast universal RNA-seq aligner. Bioinformatics 29:15–21. https://doi.org/10.1093/bioinformatics/bts635
- Liao Y, Smyth GK, Shi W. 2014. featureCounts: an efficient general purpose program for assigning sequence reads to genomic features. Bioinformatics 30:923–930. https://doi.org/10.1093/bioinformatics/ btt656
- Love MI, Huber W, Anders S. 2014. Moderated estimation of fold change and dispersion for RNA-seq data with DESeq2. Genome Biol 15:550. https://doi.org/10.1186/s13059-014-0550-8
- Li W, Wang W, Uren PJ, Penalva LOF, Smith AD, Berger B. 2017. Riborex: fast and flexible identification of differential translation from Ribo-seq data. Bioinformatics 33:1735–1737. https://doi.org/10.1093/bioinformatics/btx047