Title: Population genetics and microevolution of clinical Candida glabrata reveals recombinant sequence types and hyper-variation within mitochondrial genomes, virulence genes and drug-targets

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Raw sequences for all isolates of $C$. glabrata from this study have been deposited in the NCBI Sequence Read Archive (SRA) under BioProject PRJNA669061.

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#### Abstract

Candida glabrata is the second most common etiological cause of worldwide systemic candidiasis in adult patients. Genome analysis of 68 isolates from 8 hospitals across Scotland, together with 83 global isolates, revealed insights into the population genetics and evolution of $C$. glabrata. Clinical isolates of $C$. glabrata from across Scotland are highly-genetically diverse, including at least 19 separate sequence types (STs) that have been recovered previously in globally diverse locations, and one newly discovered ST. Several STs had evidence for ancestral recombination, suggesting transmission between distinct geographical regions has coincided with genetic exchange arising in new clades. Three isolates were missing MAT $\alpha 1$, potentially representing a second mating type. Signatures of positive selection were identified in every ST including enrichment for Epithelial Adhesins (EPA) thought to facilitate fungal adhesion to human epithelial cells. In patent microevolution was identified from seven sets of recurrent cases of candidiasis, revealing an enrichment for non-synonymous and frameshift indels in cell surface proteins. Microevolution within patients also affected EPA genes, and several genes involved in drug resistance including the ergosterol synthesis gene ERG4 and the echinocandin target $F K S 1 / 2$, the latter coinciding with a marked drop in fluconazole MIC. In addition to nuclear genome diversity, the $C$. glabrata mitochondrial genome was particularly diverse, appearing reduced in size and with fewer conserved protein encoding genes in all non-reference ST15 isolates. Together, this study highlights the genetic diversity present within the C. glabrata population that may impact virulence and drug resistance, and two major mechanisms generating this diversity: microevolution and genetic exchange/recombination.


## Article Summary (80 words)

Candida glabrata is a leading human fungal pathogen worldwide, which is increasing in prevalence and evolving antifungal resistance. Here, we report the largest wholegenome sequencing project for $C$. glabrata to date based on clinically derived candidemia isolates from hospitals across Scotland in the United Kingdom. We discover evidence for a second mating type, evidence for recombination between sequence types, hyper-diverse mitochondrial genomes, signatures of positive selection in pathogenicity genes, and in patient microevolution of drug-resistance genes.

## Introduction

Candida is the most prominent genus of the Debaryomycetaceae family, with over 400 genetically and phenotypically diverse species currently described [1]. Many of these species are harmless commensals of the mucous membranes and digestive tracts of healthy individuals. Approximately 30 Candida species are of clinical importance in humans. Most of these species that are capable of causing disease in humans belong to the CTG-Serine clade, including $C$. albicans, $C$. dubliniensis, C. tropicalis, C. parapsilosis, C. Iusitaniae, C. guilliermondii and C. auris, while others such as $C$. glabrata and $C$. bracarensis belong to the genetically distant Nakaseomyces clade [1,2]. In adult patients, C. glabrata is the second most commonly isolated species after C. albicans, which together cause approximately three quarters of all systemic candidiasis [3,4]. Infections caused by these species range from mild vulvovaginal candidiasis (VVC or thrush) to severe, drug resistant and difficult to treat invasive infections affecting single organs or the blood stream
(candidemia) with or without dissemination to the heart, brain, kidneys and other parts of the body [5]. Bloodstream infections caused by Candida spp. are associated with mortality rates of $30-60 \%$ [6,7]. Candidemia is associated with diverse risk factors including neutropenia, chemotherapy, diabetes, old age, compromised immune function, prolonged antibiotic and steroid treatment, and intravenous catheters that can harbour fungal biofilms [8]. Pathogenic Candida species including C. glabrata have also exhibited alarming increases in resistance against all major classes of antifungal drugs, hindering effective treatments and resulting in increasing mortality rates [4,9-12].
C. glabrata typically grows in the yeast form and is considered to have evolved an infection strategy based on stealth and evasion without causing severe damage in murine models [13]. This ability of $C$. glabrata and some of its relatives in the Nakaseomyces clade to infect humans is thought to have evolved recently [14], as several of its closest relatives have to date been exclusively isolated environmentally (C. castellii, N. baccilisporus, N. delphensis) [14]. Pathogenicity in the Nakaseomyces correlates with the number of Epithelial Adhesins (EPA) encoded in their genomes, which facilitate adherence and colonisation of human epithelial cells [15]. In contrast to $C$. albicans, the pathogenicity of Nakaseomyces species does not coincide with number or presence of Phospholipase-B and Superoxide Dismutase genes [16-19]. Many Candida genes involved in virulence are therefore likely to have diverse functions, some of which may not be conserved between distant clades.

Like many fungal pathogens, C. glabrata's niche(s) and life cycle are poorly understood. C. glabrata is increasingly identified among clinical samples where it is responsible for an increasing proportion of cases of candidemia [4,20]. C. glabrata has also been identified environmentally, including as a component of the mycobiota of yellow-legged gulls [21], in droppings and cloaca swabs of birds of prey, migratory birds and passeriformes [16], and other potentially transitory sources including spontaneously fermenting coffee beans [22]. Concerted efforts for sampling are required to determine the true ecological distribution of $C$. glabrata, as they are for several other important Candida species such as C. auris [23]. Furthermore, the relatedness of global isolates and their routes of transmission (either patient to patient, or between patient and the environment) requires further studies comparing genotypes to collected metadata including location of isolation.

High levels of genetic heterogeneity have been identified in the C. glabrata population, as molecular methods have identified diverse strains, clades and Sequence Types (STs) both inter- and intra-nationally [24,25]. As of January 2022, the Multi Locus Sequence Type (MLST) database for C. glabrata included 233 STs from 1,414 isolates from 29 countries, based on the sequence identity for 6 genetic loci [26]. All isolates of $C$. glabrata reported to date have been haploid, with occasional aneuploids e.g. transitory disomies of chromosomes E and G [24].

Genetic heterogeneity within many fungal populations is shaped by their ability to switch between clonal and sexual recombination [27]. The ability for $C$. glabrata to undergo a sexual cycle remains unknown, with all reported attempts in the laboratory to encourage mating thus far unsuccessful. C. glabrata has therefore
been regarded as an asexual species, despite the presence of well conserved mating loci $[28,29]$ and 14 examples of phylogenetic incompatibilities from multi locus sequencing [30]. More recent genomic analysis from 34 globally isolated $C$. glabrata strains revealed evidence of population admixture, suggesting a thus far undiscovered sexual cycle [24]. Greater sampling efforts and genomic analyses are therefore required to fully explore signatures of adaptation, virulence and recombination.

In this study, we explore the population genetics and microevolution of $C$. glabrata using comparative genomic analysis of 68 clinical $C$. glabrata isolates from 8 hospitals across Scotland, combined with 83 publicly available and globally isolated genomes, finding evidence of recombinant STs, hypervariable mitochondrial genomes, as well as variation in virulence genes and drug-targets between STs and between serial isolates from prolonged or recurrent infection.

## Materials and Methods

## Library preparation, sequencing and antifungal tests

Candida glabrata was collected from blood in 2012 from eight hospitals in Scotland (Table S1). These isolates were collected as part of a retrospective study of all cases of Candida blood stream infections carried out within Scotland under NHS Caldicott Guardian approval from March 2012 to February 2013, as described previously [4,31].

Genomic and mitochondrial DNA was extracted from 68 isolates using the QIAamp® DNA mini extraction kit (Qiagen) according to the manufacturer's
instructions. A small modification was made prior to extraction which was to mechanical disrupt the yeast. This was achieved by bead-beating the cells with sterile acid-washed 0.5 mm diameter glass beads (Thistle Scientific) for $3 \times 30 \mathrm{~s}$. Following isolation and extraction using the QIAamp columns the DNA was eluted into elution buffer before storage at $-20^{\circ} \mathrm{C}$ and transport to the sequencing facility.

Library preparation was performed by the Centre for Genome-Enabled Biology and Medicine at the University of Aberdeen. Briefly, gDNA quality was assessed on a Tapestation 4200 with a high sensitivity genomic DNA tape (Agilent) and quantified by fluorimetry using Quant-IT dsDNA High-sensitivity (HS) assay (Thermo Fisher). Dual indexed Illumina libraries were prepared from 1 ng purified gDNA using an Illumina Nextera XT DNA library preparation kit and Nextera XT v2 indices, which were purified from free adapters using AMPure XP beads (Beckman Coulter). Libraries were quantified using Quant-IT dsDNA High-sensitivity (HS) assay (Thermo Fisher) and average fragment size was calculated on Tapestation 4200 (Agilent), then equimolar pooled at 10 nM . Concentration of the pool was verified by qPCR (Kapa library quantification kit, Roche) on QuantStudio 6 using SYBR green, and 1.8 pM of the library pool was sequenced on an Illumina NextSeq500 with 150bp paired end reads and 8bp index reads to average alignment depths of 41.9X (Table S2). This data was supplemented with paired end Illumina reads from Carreté et al. [24], and isolate CBS138 from Xu et al. [32].

Minimum inhibitory concentration (MIC) tests for fluconazole were performed at the Mycology Reference Laboratory, Public Health England, Bristol, according to
standard Clinical and Laboratory Standards Institute (CLSI) broth microdilution M27 guidelines [33].

## Variant calling

The Genome Analysis Toolkit (GATK) v.4.1.2.0 [34] was used to call variants. Our Workflow Description Language (WDL) scripts were executed by Cromwell workflow execution engine v. 48 [35]. Briefly, raw sequences were pre-processed by mapping reads to the reference genome C. glabrata CBS138 using BWA-MEM v.0.7.17 [36]. Next, duplicates were marked, and the resulting file was sorted by coordinate order. Intervals were created using a custom bash script allowing parallel analysis of large batches of genomics data. Using the scatter-gather approach, HaplotypeCaller was executed in GVCF mode with the haploid ploidy flag. Variants were imported to GATK 4 GenomicsDB and hard filtered if QualByDepth (QD) < 2.0, FisherStrand (FS) >60.0, root mean square mapping quality (MQ) < 40.0, Genotype Quality $(G Q) \geq 50$, Allele Depth $(A D) \geq 0.8$, or Coverage (DP) $\geq 10$.

To identify aneuploid chromosomes, depth of coverage was calculated for each of 206 fungal samples. Sorted BAM files prepared in the pre-processing phase of SNP calling were passed to Samtools v.1.2 [37] and mpileup files were generated. Read depth was normalised by total alignment depth and plotted against the location in the genome using 10 kb non-overlapping sliding windows. To identify structural variation, assembly de novo was achieved using Spades v3.12 [38] using default parameters.

## Phylogenetic and population genetic analysis

To construct species-specific phylogenetic trees, all sites that were either a homozygous reference or SNP in every isolate were identified using ECATools (https://github.com/rhysf/ECATools) and concatenated into a FASTA file. Our rooted tree C. bracarensis included 1,198 phylogenetically informative sites, while the unrooted C. glabrata tree included 34,980 phylogenetically informative sites. Phylogenetic trees were constructed with RAxML PThreads v.7.7.8 [39] using the general-time-reversible model and CAT rate approximation with 100 bootstrap support, both with rooting to $C$. bracarensis AGP [40] or midpoint rooting without $C$. bracarensis. We constructed a tree using the same models with 1000 bootstrap support for all Saccharomycetaceae species that had a genome assembly in NCBI or JGI Mycocosm. We also constructed neighbour-joining trees using PAUP v4.0b10 [41] and a NeighborNet Network with SplitsTree v.4.15.1 [42]. Trees were visualised using FigTree v. 1.4.4 (http://tree.bio.ed.ac.uk/software/figtree/).

A multisample variant call format (VCF) corresponding to all 151 genomes was made with VCFTools v0.1.12 vcf-merge [43] and converted to ped and map file formats for use in PLINK v1.90 [44]. VCFTools was used to calculate genetic diversity metric pi, using the --site-pi parameter. Unsupervised ADMIXTURE [45] (settings: --haploid="*" -s time) was run on a moderately linkage disequilibrium (LD)pruned alignment (PLINK --indep-pairwise 60100.1 ) for values of $K$ between 1 and 35. A value of $K=20$ provided the lowest cross-validation error. Principle component analysis was performed using SmartPCA v4 [46]. Consensus gene sequences for each isolate were generated, and genes FKS2 (CAGLOK04037g) positions 240-828, LEU2 (CAGL0H03795g), NMT1 (CAGL0A04059g), TRP1 (CAGL0C04092g), UGP1 (CAGLOL01925g), and URA3 (CAGLOIO3080g) were used to identify known MLST
for each of the isolates, and confirm that isolate CG57 was an unknown MLST and registered as the new ST204 on PubMLST (https://pubmlst.org/organisms/candidaglabrata) [47].

We applied Weir's estimator [48] of Wright's Fixation Index $\left(F_{S T}\right)$ according to the equations given in Multilocus 1.3 [49] using non-overlapping sliding windows. The scripts have been made available online (https://github.com/rhysf/FSTwindows).

## Selection and microevolutionary analysis

The direction and magnitude of natural selection for each ST were assessed by measuring the rates of non-synonymous substitution $(d N)$, synonymous substitution $(d S)$ and omega ( $\omega=d N / d S$ ) using the yn00 program of PAML [50], which implements the Yang and Nielsen method, taking into account codon bias [51]. Further GC corrections were not applied. The program was run on every gene in each isolate using the standard nuclear code translation table. To examine the functional significance of genes with $\omega>1$, we evaluated their Pfam domains and Gene Ontology (GO) terms for statistical enrichment (genes with $\omega>1$ vs, the remaining genes) using the two-tailed Fisher exact test with Storey false discovery rate (FDR)-corrected $P$ values (q) of $<0.05$. GO Terms were acquired using Blast2Go v6.0.1 [52] using Blastp-fast to the NCBI BLAST nr-database (E-value < 1E-5).

Genes of interest were defined including both FKS and 12 ERG pathway genes, as well as all genes listed in Table 1 of [53], which included adhesions including EPA genes, aspartic proteases, phospholipases, cell wall biogenesis,
structural wall proteins, regulatory, efflux pumps. This gene list was then screened for genes with either signatures of positive selection, or those undergoing microevolutionary changes (non-synonymous and frameshift indels).

## Results

## Recombinant sequence types in Scottish clinical samples

Clinical isolates of Candida glabrata from across Scotland are highlygenetically diverse. Using whole-genome sequencing, we analysed the genomes for 68 isolates of $C$. glabrata from 47 separate patients across eight Scottish hospitals, generating the largest panel of $C$. glabrata genome sequences to date. These 68 isolates belonged to twenty separate sequence-types (ST) of $C$. glabrata, which represent genetically related sub-populations based on alleles from six loci/genes. One isolate (CG57 from a single patient in Forth Valley Royal Hospital) belonged to a new ST that has not been previously identified anywhere else (ST204) (Fig. 1, Table S1, Table S2). Variant calling using the diploid model of GATK found few examples of heterozygosity $\underline{(<0.41}$ per kb for every isolate) suggesting all isolates were haploid (Table S3). Our panel of C. glabrata isolates was supplemented with a further 83 genomes from three recent studies of global C. glabrata isolates [24,25,32], as well as sequences from the outgroup C. bracarensis [40], which has also been identified from clinical settings and is the closest known relative of $C$. glabrata [14].

Phylogenetic analysis of our Scottish collection along with the worldwide $C$. glabrata isolates revealed high genetic diversity among the 29 separate STs represented by our combined panel (Fig. 2, Fig. S1). Allelic diversity among $C$.
glabrata isolates (mean nucleotide diversity $(\pi)=0.00665, \sigma=0.047$ ) was higher than previously reported ( $\pi=0.00485$ based on the Internal Transcribed Spacer (ITS) of 29 strains [54]). Our WGS-based calculation of $C$. glabrata $\pi$ was the highest of any species in the Saccharomycetaceae that had both an available genome assembly and a calculation of $\pi$ (albeit those are based on ITS sequences and fewer strains than we had) [54] (Fig. 3a). However, C. glabrata genetic diversity was typical among the Saccharomycotina (mean $/ \bar{x}=0.0055$, median $=0.0039$, standard deviaton $/ \sigma=0.0055$ ) (Fig. 3b). Nucleotide diversity within the population was present across the nuclear genome (Fig. 3c), with window length having some impact on the result (smaller window lengths (5 kb) resulted in higher average $\pi$ in approximately half of the genome: chromosomes A-F, M and H). Most of the allelic diversity across the 151 C. glabrata isolates came from the nuclear genome ( $\mathrm{min} .=$ 0.09 SNPs / kb, max. $=6.54$ SNPs $/ \mathrm{kb}, \overline{\mathrm{x}}=5.55$ SNPs $/ \mathrm{kb}$ ) compared with the mitochondrial genome (min. $=0.05$ SNPs $/ \mathrm{kb}, \max .=3.64 \mathrm{SNPs} / \mathrm{kb}, \overline{\mathrm{x}}=1.21$ SNPs / kb). Indeed, a significant difference between nuclear SNPs / kb and mitochondrial SNPs / kb was found using a two-tailed $t$-test for all 151 genomes ( $p=$ 5.6147E-111).

Seven clade (C) delineations for C. glabrata were recently proposed [24], which were equivalent to pre-existing STs including C1 (ST19), C2 (ST7), C3 (ST8), C 4 (ST22), C6 (ST136) and C7 (ST3). We found that C5 was polyphyletic, encompassing isolates belonging to the genetically divergent ST6, ST10 and ST15 (Fig. S1). Therefore, we recommend the use of ST delineations rather than those clade delineations.

Several C. glabrata STs had evidence of genetic recombination. Our neighbour-net network tree of all isolates suggested historic gene-flow between several STs including for example ST7, ST55 and ST162 (Fig. 2). Genomic regions with low Wright's fixation index $\left(F_{S T}\right)$ values, consistent with genetic exchange, were also identified from pairwise comparisons $(n=435)$ across 5 kb and 10 kb nonoverlapping windows of all STs (Fig. S2). $x F_{S T}$ values calculated from 5 kb windows were slightly lower than those calculated from 10 kb windows (averaging -0.046 for each ST pairwise comparison), indicating that window length impacts this measure of genetic variation. Twelve pairwise comparisons from 10 kb windows had $F_{S T}<0.9$ across the genome (Fig. S3), with the lowest for ST18 and ST26 ( $F_{S T}=0.64$ ). Additionally, ST7, ST55 and ST162 had lower $F_{S T}$ values across the genome ( $F_{S T}=$ 0.65-0.83) than other pairwise comparisons demonstrating incompatible phylogenetic signals between these STs (Fig. S2).

Principal-component analysis (PCA) of whole-genome SNPs revealed little evidence of clustering of several C. glabrata STs, which is consistent with gene flow between them (Fig. 4A). For unsupervised model-based clustering with ADMIXTURE, we first identified that $K=20$ had the lowest cross-validation error (Fig. 4B), and was therefore used for subsequent analysis. Two isolates were consistently ( 6 independent Admixture runs) found to have evidence for mixed ancestry: ST177 CG1 and our newly discovered ST204 CG57 (Fig. 4C, Fig. S4). Other isolates were found to have evidence of mixed ancestry in the majority of runs including ST124 WM18.66, ST126 WM05.155 and ST8 M17.

Only one of the Scottish isolates (CG46) had evidence for Chromosome Copy Number Variation (CCNV)/aneuploidy, found in Chromosome C (Fig. S5). Distributions of normalised chromosome read depths of chromosome C (average depth per 10 kb window $=0.68$ ) differ significantly from the rest of the genome of CG46 (average depth per 10kb window $=1.05$; Kolmogorov-Smirnov Test: $p=$ $2.09 \mathrm{E}-25)$, with coverages of chromosome C significantly lower than in the rest of the genome (Wilcoxon rank-sum test: $p=1.353 E-25$ ). No other CCNVs were found, despite many isolates having been treated with antifungals that have previously been correlated with CCNV [55]. Together, these results suggest occasional genetic recombination within the C. glabrata population, without an association with aneuploidy.

Mating types and mating type switching are poorly understood in C. glabrata, although it is thought that Mating-type regulatory protein $\alpha 2$ is expressed in all MTL $\alpha$ strains and not in MTLa strains [56,57]. MAT 2 (CAGL0B01265g) was present in all Scottish isolates (breadth of coverage; BOC $>87 \%$ ). However, MAT $\alpha 1$ appeared to be absent or partially absent in 3/9 ST6 isolates (CG12 $=16 \%$ BOC, CG121 $=18 \%$ BOC, CG42 $=12.5 \%$ BOC), while present in the remaining six ST6 isolates, and all the other STs (BOC 100\%). The functional relevance of MAT $\alpha 1$ deletion or truncation is unclear but may be a hallmark of the rarer of the two mating types.

## Hyper-variable mitochondrial genomes among sequence types

$F_{S T}$ analysis highlighted the mitochondrial genome of $C$. glabrata as hypervariable (Table S2, Fig. S6). Forty-three genes were identified in $\geq 10$ pairwise $F_{S T}$ comparisons, including all eleven mitochondrial protein encoding genes. To explain
this enrichment of low $F_{S T}$ mitochondrial genes, we studied the 151 genome alignments. While the nuclear genome had 97.3-99.4\% BOC, the mitochondrial genome had 20.4-99.9\% BOC, with 42\% of isolates ( $n=63 / 151$ ) containing $>10 \%$ ambiguous mitochondrial bases (2 kb) (Table S2) (here, we define ambiguous as sites with too few reads aligning to be called by GATK, or reads that cannot be called by GATK due to not passing variant filtration). Surprisingly, a pattern of low and/or patchy read coverage was identified in every isolate including the ST15 reference isolate CBS138 (Fig. S6), indicating that the reference mitochondrial sequence assembly [58] may have a high error rate, and given additional differences identified in non-reference isolates, that $C$. glabrata mitochondrial genomes are highly heterogenous.

The mitochondrial genome for some C. glabrata isolates appears reduced in size and encodes fewer protein encoding genes (Fig. 5). As many as 22/37 (59\%) mitochondrial encoded genes were entirely absent in at least one isolate, including Cg1, Cg1II, and Cg1III (putative endonucleases of exons and introns in the mitochondrial COX1 gene), ATP8 and ATP9 (subunits 8 and 9 of the enzyme complex required for ATP synthesis), RPM1/RPR1 (RNA component of mitochondrial RNAse P), VAR1 (putative mitochondrial ribosomal protein of the small subunit, ) and most of the tRNA genes (15/23). Nine separate STs had absent mitochondrial genes. Normalised depth of coverage was variable across the genes, with $<1$ average normalised depth across all isolates for $\mathrm{Cg} 1, \mathrm{Cg} 1 \mathrm{II}$, and Cg 1 III , ATP8, RPM1, VAR1 and tRNA-Met1. While non-uniform coverage in terms of depth and breadth was found across all mitochondrial genomes belonging to all datasets, our newly sequenced isolates have the lowest mean breadth across mitochondrial
genes $(\bar{x}=92.18, \sigma=20.07)$ compared with Biswas et al. $[25](\bar{x}=98.48, \sigma=11.47)$ and Carreté et al. [55] ( $\bar{x}=97.03, \sigma=14.11$ ), suggesting there are some discrepancies between library preparation impacting mitochondrial read sequencing. Notably, only $1 / 50$ Biswas et al. [25] isolates (WM03.450) had entirely absent mitochondrial genes compared with 8/32 Carreté et al. [55] isolates and 15/68 of our newly sequence isolates. Total sequencing depth can be ruled out as the main cause for low mitochondrial coverage, given Carreté et al. [55] had the highest sequencing depth ( $\bar{x}=360 X$ ) and had many isolates with absent mitochondrial genes, compared with Biswas et al. [25] ( $\overline{\mathrm{x}}=74 \mathrm{X}$ ) and ours ( $\overline{\mathrm{x}}=42 \mathrm{X}$ ).

We used assembly de novo to further explore the mitochondrial sequence for isolate WM03.450 (ST83), which had the greatest number of ambiguous bases across its mitochondrial genome (16 kb / 80\%). Our WM03.450 Illumina-based assembly ( 12.9 Mb ; N.contigs $=\sim 3$ thousand; $\mathrm{N}_{50}=85 \mathrm{~kb}$ ) is 562 kb longer than the CBS138 reference sequence, indicating substantial genomic differences between these isolates and STs. Aligning our assembly to the reference CBS138 mitochondrial genome using Blastn identified 10 contig matches with a combined alignment length of only 1.9 kb (mean 157 nt per contig), suggesting the low alignment is not due to conserved nucleotide sequences that have undergone large rearrangements. Aligning the assembly to the eleven mitochondrial protein sequences using Blastx identified only $6 / 11$ genes across six separate contigs, four of which were < 364 nt length, and two that are 10.4 kb and 81.5 kb . Conversely, assembly de novo and Blastx of our Illumina reads for the reference isolate CBS138 against the published CBS138 genome identified all eleven mitochondrial genes present on four contigs, with 18.9 kb total sequence length, of which Blastn aligned

# 9.3 kb to the published mitochondrial assembly. Together, these analyses suggest that whole gene deletions in the $C$. glabrata mitochondria are common. 

## Signatures of selection identified among sequence types

In contrast to the C. glabrata mitochondrial genome, we found that gene deletions in the nuclear genome are rare. Indeed, fewer than six presence/absence ( $\mathrm{P} / \mathrm{A)}$ polymorphisms (strictly defined as zero reads aligning) were identified per isolate ( $\sim 0.1 \%$ of 5,210 protein-encoding genes) (Table S4). Of these, two consecutive nuclear-encoded genes (CAGLOA02255g and CAGL0A02277g) on Chromosome A were entirely absent of read coverage in 25 out of the 68 Scottish isolates (37\%), which included all representatives of eleven separate STs (ST4, 7, 8, $24,25,55,67,83,177$, and our newly described 204). These STs do not cluster phylogenetically, ruling out a single evolutionary event causing this deletion. The two genes have identical nucleotide sequences and encode the same amino acid sequence, which is conserved across a range of other Ascomycota species, as well as having sequence similarity to the K62 Killer Preprotoxin protein encoded by the Saccharomyces paradoxus L-A virus M62 satellite (BLASTp E-value $=1 \mathrm{e}-36$ ), suggesting a possible viral origin. CAGL0F09273g is a separate, putative adhesinlike protein (adhesin cluster V ) with a "hyphally regulated cell wall protein N -terminal" PFAM that is lost in eleven isolates including all ST4 (CG68A, CG77), four ST7 (CG157, CG48A, CG48F, CG78), three ST8 (CG127, CG52, CG82), ST19 CG119, ST24 CG166 and ST147 CG133. Again, this gene must have been lost multiple times, given its presence in several ST7 and ST8 isolates. This gene is the last gene on Chromosome F, has an $\pi=0.00244$, which is lower than the overall average across the genome, and has previously been reported to undergo CCNV within serial
clinical isolates [55], suggesting it is able to undergo variation within microevolutionary timescales, which may impact the adhesive ability of these $C$. glabrata isolates.

Between 61 and 85 genes with a signature of positive selection $(d N / d S=\omega$, and $\omega>1$ [59]) were found in each ST apart from the reference ST (ST15 CG151), for which only a single gene with $\omega>1$ ( $\omega=1.0019$ ) was identified (Table S5). Apart from the reference ST, STs had between 4 and 14 genes with $\omega>2$, showing stronger signatures of diversifying or positive selection. Of the 2,083 total genes with $\omega>1$ across all clades, 608 were unique genes ( $11.6 \%$ of all genes) i.e., they had this signature in multiple clades, owing to either ancestry or selection acting on the same gene families. To explore selection, we took an unbiased approach using PFAM and GO-term enrichment comparing the numbers of each term in those 608 genes compared with the remaining non-selected genes, as well as a targeted approach for genes of interest (see Methods Selection and microevolutionary analysis) including adhesins, proteases, efflux pumps, FKS, and ERG pathway genes.

Genes with signatures of positive selection within the C. glabrata population targets diverse genes and gene functions. Our unbiased approach for enrichment of functional domains in 608 gene products with signatures of positive selection identified only three significantly enriched (two-tailed Fisher exact test with false discovery rate (FDR)-corrected p-values (q) of < 0.05) PFAM domains and 16 GO terms (Table 1). The enriched PFAM domains were 1) Flocculin repeat (PF00624.20; $q=7.42 \mathrm{E}-17), 2$ ) GLEYA domain (PF10528.11; $q=0.01$ ) and 3) Armadillo repeat
(PF00514.25; $q=0.02$ ). Flocculin is a sub-telomeric gene family involved in flocculation or cell aggregation in S. cerevisiae [60], while GLEYA domains are present in C. glabrata EPA proteins. Thirty Flocculin PFAM domains were assigned to only six genes in C. glabrata, two of which have $\omega>1$ : CAGLOIO7293g and CAGLOIO0220g, and together account for 23/30 Flocculin repeat PFAMs. Enriched GO-terms covered a range of possible biological functions including ribosomal/RNAbinding and mitochondrial structural proteins.

Our targeted approach highlighted 21/129 genes of interest that have $\omega>1$, with at least one found in every ST apart from the reference ST15 and ST46 (Table S6). Notably, none of the aspartic proteases, phospholipases, cell wall biogenesis, efflux pumps, ergosterol biosynthesis pathway genes or FKS genes were found to have hallmarks of positive selection, implying these are conserved within the population. Several genes with $\omega>1$ were found in multiple STs, including adhesive protein CAGLOJ01727g (adhesin cluster VI ) that is under positive selection in seven STs (18, 26, 36, 45, 147, 177, 204) and adhesive protein CAGLOIO7293g (adhesin cluster V ) under positive selection in seven mostly distinct STs (3, 8, 25, 83, 123, 136, 177). C. glabrata encodes 17 putative adhesive proteins without $N$-terminal signal peptides, casting doubt on their role in adhesion. One of these is a pseudogene (CAGLOE00110g) with $\omega>1$ in $13 / 29$ STs. The structural cell wall protein AWP7 belonging to the Srp1p/Tip1p family was under selection in 7 STs.

## C. glabrata nosocomial in-patient microevolution targets pathogenicity factors

 and drug targetsOur Scottish C. glabrata panel included seven sets of between 2 and 9 isolates from recurrent cases of candidiasis. To explore the microevolution of $C$. glabrata within a human host, and the effects of antifungal treatment (fluconazole, nystatin, and posaconazole) on fungal genetics, we documented all genetic changes between serial isolates (Table 2, Table S7). Although exact dates of isolation were not documented, phylogenetic analysis (Fig. S1, Fig. 6) confirmed these serial isolates were highly related, with between 64 and 140 mutations $\left(1.13468 \times 10^{-5}\right.$ per base pair) identified between pairs of serial isolates (Fig. 6). While the mutation rate or generation time for $C$. glabrata is not known [55], this small number of mutations likely suggests recent clonal origins appropriate for microevolutionary analysis. Serial isolates had an estimated time between isolation (based on blood culture dates) between 0 and 239 days (mean 15 days). Five serial isolates from 4 separate patients/cases showed MIC changes from the earlier sampled isolate (Table 3), including 2 increases (CG107A->B +8 ug/mL, CG97B->C $+4 \mathrm{ug} / \mathrm{mL}$ ), 1 decrease (CG84G->H -4 ug/mL,) and 1 large transient increase (CG93A, B, C, D, E = $4 \mathrm{ug} / \mathrm{mL}$; CG93H, I, K >64 ug/mL, CG93K = $4 \mathrm{ug} / \mathrm{mL}$ ).

Mutations identified between serial isolates were mostly in protein coding sequence (CDS) regions (between 53 and 127 mutations per pairs of serial isolates, collectively adding up to $1,741 / 1,995$ total mutations $=87 \%$ ), despite protein-coding regions taking up only 7.9 / 12.3 Mb (64\%) (Fig. 6B, 6C). The remaining serial mutations were within intergenic regions (236 mutations; 12\%) and intronic regions (18 mutations; 1\%). Intronic regions had the highest count of serial mutations after accounting for the total sequence in introns (Fig. 6C), albeit with $\leq 3$ found per pair of serial isolates. Hypergeometric tests revealed that the number of mutations in coding
sequence compared with non-coding sequence was higher than expected by chance, suggesting a highly significant enrichment of mutations in protein coding genes $(p=3 e-120)$.

To explore the 1,741 microevolutionary changes within coding regions, we categorised them into five groups of newly arising mutations (regardless of prior state): 1 ) insertions/deletions (indels) ( $n=362 ; 21 \%$ ), 2) synonymous mutations ( $n=$ $264 ; 15 \%)$, 3) non-synonymous mutations ( $n=303,17 \%$ ), 4) nonsense mutations ( $n$ $=2$ ), and 5) reversion back to reference base ( $n=810 ; 47 \%$ ). Of the indels, $147 / 362$ ( $41 \%$ ) were frameshifts that disrupted 54 genes. Non-synonymous mutations were detected in 139 genes (Fig. 6D, 6E).

Enrichment for PFAM/GO-terms of these genes with frameshift and nonsynonymous mutations (two-tailed Fisher exact test with false discovery rate (FDR)corrected $p$ values $(q)$ of $<0.05)$ revealed three enriched GO-terms and eight enriched terms (Table 1). Both categories (frameshifts and non-synonymous mutations) were enriched for GO:0009986 Cell Surface ( $q=3.21 \mathrm{E}-08$ and 1.09E-06, respectively), suggesting that $C$. glabrata undergoes rapid mutations in several of its cell surface proteins during prolonged/serial blood stream infections. Enriched PFAM terms included the "RNA polymerase RPB1 C-terminal repeat" for genes with frameshift indels ( $q=1.25 \mathrm{E}-36$ ), GLEYA domains for genes with either frameshift ( $q$ $=3.15 \mathrm{E}-12$ ) or non-synonymous mutations ( $q=3.58 \mathrm{E}-08$ ). Several repeat associated PFAMs and the "Hyphally regulated cell wall protein N-terminal" domain were enriched for non-synonymous mutations ( $q=5.87 \mathrm{E}-04$ ).

Several genes of interest (see Methods: Selection and microevolutionary analysis) had microevolutionary changes ( $n=29 / 129$ ) (Table S8). Notably, one of the two newly acquired nonsense mutations was identified in FKS2 (Case $6 \mathrm{~J}->\mathrm{K}$ ), coinciding with a substantial drop in fluconazole MIC (Table 3). The other was in the uncharacterised CAGLOK04631g at an earlier time point in the same patient (Case 6 D->E).

Twenty adhesins including EPA genes were mutated between serial isolates, including in all seven sets/cases of isolates and at every time point. For example, EPA3 had 5 indels in Case $1(A->B)$, a synonymous mutation in Case $2(A->B$; nucleotide position (pos.) 2304), Case 3 (D->E; pos. 1539), Case 4 (A->F; pos. 1119), Case 5 (F->G; pos. 2259), a non-synonymous mutation (pos. 2224) and large (30nt) insertion in Case 5 (G->H), two large deletions (42nt and 16nt), and two synonymous and one non-synonymous mutations in Case 6 (A->B; pos. 1002, 2319 and 2276 respectively).

The longer 42nt deletion from Case 6 (A->B) reverts back to reference in Case 6 (B->C), suggesting either a) a non-descendent isolate (intra-host variation), b) a false negative reference in 6 C or c ) a false positive deletion in 6 A . The same 42nt deletion, along with a new insertion at the site of the previous synonymous mutation appears in Case 6 (C->D), thereby suggesting the variant is real and option c less likely. That 42nt deletion reverts back to reference in Case 6 (D->E), and appears again in Case $6(\mathrm{E}->\mathrm{H})$. By Case $6(\mathrm{H}->\mathrm{I})$, the gene has a new synonymous mutation, and in Case $6(\mathrm{l}->\mathrm{J})$ it has accumulated a new 15 nt deletion. EPA3 is therefore a hot-spot of variation. Another EPA gene that accumulated a large
number of mutations was AWP12, which accumulated five non-synonymous mutations and one synonymous mutation (Case $6 \mathrm{H}->\mathrm{I}$ ).

Other genes that had accumulated mutations between serial isolates included those encoding an aspartic protease YPS5, several structural wall proteins belonging to the Srp1/Tip family, regulatory protein PDR1, the ergosterol synthesis gene ERG4 (a non-synonymous mutation in Case 3A->B), and both FKS1 and FKS2. Therefore, C. glabrata genes that are antifungal targets and gene families involved in drugresistance and pathogenicity can therefore undergo rapid mutation within a human host.

## Discussion

In this study, we sequenced and analysed the largest panel of $C$. glabrata genomes to date. These isolates were collected from blood-stream infections of patients at several Scottish hospitals in 2012. Our 68 genomes were analysed alongside 83 further publicly available and globally isolated genomes [25,32,55], revealing greater genetic diversity than previously recognised, including a nucleotide diversity of 0.00665 , which is much higher than has been calculated for the distantly related C. albicans at 0.00298 [54]. Surprisingly, we found that only one of our Scottish isolates had evidence of aneuploidy, despite many having been treated with antifungals, which has previously been correlated [55]. Chromosome C in CG46 had lower depth of coverage compared with the rest of the genome, perhaps due to chromosome loss in a subset of cells. The patient that CG46 was isolated from was initially treated with Fluconazole. Following resistance to Fluconazole being
detected, the patient was subsequently treated with Caspofungin, suggesting a potential link between those antifungal treatments and the observed aneuploidy.

We found that the mitochondrial genome of $C$. glabrata was hyper-diverse compared with its nuclear genome for many isolates, including several long deletions spanning one or more genes, with the potential to impact many important biological functions including drug resistance and persistence [61]. High levels of variation in mitochondrial genomes within the major fungal phyla have previously been noted in terms of gene order, genome size, composition of intergenic regions, presence of repeats, introns, associated ORFs, and evidence for mitochondrial recombination in all fungal phyla [62]. This variation is lacking in Metazoa [62]. Our results suggest some of these types of mitochondrial genetic diversity are likely present within the $C$. glabrata population.

Isolates in this study belonged to twenty-nine separate sequence types (STs) of $C$. glabrata, each of which was separated by large number of variants. However, as many as 193 MLST STs have been documented [47]. Therefore, it is likely that the true genetic diversity of $C$. glabrata is much higher than we have been able to calculate with whole-genome sequences (albeit the largest panel studied to date). Indeed, several further STs may yield further evidence of recombination or lack of, and may ultimately require a new effort to group STs into lineages (also dependent on the frequency of recombination that erode these divisions). The genetic diversity of $C$. glabrata in hospitals around Scotland is extremely high, with representatives from 20 STs. Such high genetic diversity (and many of the same STs) have also been found from genome sequencing and phylogenetic analysis of isolates collected
in other countries such as Australia [25], suggesting they must have been transported across or between continents, perhaps by anthropogenic or even natural means (for example its association with birds [16,21] and food [22]). Greater sampling and genotyping of clinical and environmental isolates will be required for understanding ancestry or endemicity.
C. glabrata has long been regarded as a haploid asexual yeast, although evidence has recently emerged of a cryptic sexual cycle [28-30]. Our genome sequencing and population genetics supports this work, revealing compelling evidence that at least 12 sequence types (STs) stem from recombination between other STs. However, further work remains to document and describe individual recombinant isolates. Providing genetic recombination between isolates is naturally occurring, the mechanisms of genetic exchange are also unknown, although likely relate to the conserved mating type locus, which play a central role in the sexual cycle of diverse fungi [63]. Here, we show that the MAT $\alpha 1$ gene was absent or partially absent in three isolates belonging to ST6, which could potentially impact or even be a hallmark of a rarer second mating type of $C$. glabrata. Together, genetic recombination among C. glabrata isolates appears much more common than previously recognised, and likely contributes to increased genetic diversity.

The nuclear genome for isolates belonging to every ST (apart from the reference ST15 that was included as a control) included evidence of positive or diversifying selection. Signatures of positive selection were found enriched in genes with diverse functions, including several with repeat domains, as well as EPA genes with GLEYA domains. EPA genes are a large sub-telomeric family of virulence-
related surface glycoprotein-encoding genes encoded by several other pathogens including Plasmodium, Trypanosoma, and Pneumocystis [64]. Such gene differences between STs of $C$. glabrata may result in clinically-relevant phenotypic differences.

In host microevolutionary changes between serial isolates were enriched within coding-sequences, which is a surprise, given the expectation for intergenic regions to be more permissive to mutations due to relaxed selection within intergenic regions and purifying selection within coding sequence. The reason for this abundance of serial mutations in coding sequence is unclear, although it could potentially be technical (e.g. false negative variants within repetitive sequences) or biological (e.g. drug exposure and host immune pressure). Alternatively, enriched mutations in genes could potentially be driven by processes such as DNA polymerase induced mutations, or differences in chromatin states (e.g. heterochromatin could lead to increased exposure to DNA damaging agents resulting in higher mutation rates, or conversely, greater surveillance and correction of mutations in euchromatin regions by cellular DNA repair enzymes [65]).

Selection may explain why we identified similar numbers of non-synonymous mutations to synonymous mutations, given random mutations are expected to be non-synonymous in $\sim 2 / 3$ nucleotides of each codon. Furthermore, accumulations of deleterious mutations could be occurring in the serial isolates due to small population sizes, although population size estimates could not be calculated accurately from the metadata.

Genes with GLEYA domains including EPA genes were significantly enriched for frameshift and non-synonymous mutations in the coding sequence between serial isolates. Combined with our finding of positive selection in EPA genes across STs, suggests that EPA genes are undergoing variation at both longer time frames and microevolutionary time-scales.

Genes encoding several important drug-targets also underwent mutations between serial isolates, including a non-synonymous mutation in the ergosterol biosynthesis pathway gene ERG4, and a nonsense mutation in the $1,3-\beta$-glucan synthase component FKS2 (mutations in these genes can confer resistance to azoles [66] and echinocandins [67] respectively). Indeed, the nonsense mutation in FKS2 coincided with a marked drop in fluconazole MIC for isolate CG93K, suggesting a possible link.

Our study highlights the need for further sampling and genomic analysis of $C$. glabrata in order to better inform the population structure and mechanisms underlying its increasing emergence, pathogenicity and multi-drug resistance. While we have largely focused on differences among the conserved regions of the $C$. glabrata ST15 CBS138 genome using an alignment-based strategy, our discoveries of a hyper-diverse mitochondrial sequence highlight the value for future long-read sequencing and assemblies to characterise the pan-genomes of C. glabrata and structural genomic diversity that exists among and perhaps within STs, and to explore the mechanisms driving those changes. Furthermore, given the genetic diversity between STs that we document, it would likely be valuable to sequence and assemble additional high-quality reference sequences for the purposes of increasing
variant-calling accuracy and quantifying gene content between different STs. Given the low and patchy alignment depth across the ST15 CBS138 mitochondrial sequence for that same isolate, a review and update for the published CBS138 mitochondrial genome is likely required as well. Indeed, high ( $\sim 0.5 \%-1 \%$ ) frequencies of structural variation in the nuclear genomes of $C$. glabrata isolates was recently found using de novo assemblies from long single-molecule real-time reads [68].

The rapidity that $C$. glabrata can mutate important genes and gene families, both via microevolution and putative recombination highlights an obstacle for future drug-development, given that individual gene targets are able to mutate within short time spans, and substantial diversity already present between STs. In addition, the epidemiology of $C$. glabrata is poorly understood. Future sampling and genomic comparison studies are necessary to identify the routes and mechanisms of its spread and evolution.

## Data availability

Raw sequences for all haploid isolates of $C$. glabrata from this study have been deposited in the NCBI Sequence Read Archive (SRA) under BioProject PRJNA669061.

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## Competing Interest Statement

The authors declare no competing interests.

## Figures and Tables

Figure 1. Candida glabrata isolates were collected across eight health boards across Scotland in 2012, belonging to 20 separate sequence types, including the newly described ST204. Duplicate isolates stemming from the same patient at different time points have been excluded.

Figure 2. A NeighborNet network using SplitsTree, with sequence types (ST) labels replacing isolate names at the nodes. Green $=$ found in Scotland, purple $=$ not found in Scotland. The scale bar represents nucleotide substitutions per site.

Figure 3. a) A RAxML phylogenetic tree with 1000 bootstrap support of all Saccharomycetaceae species that had a genome assembly in NCBI or JGI

Mycocosm and nucleotide diversity ( $\pi$ ). Note: C. glabrata is calculated from whole genome sequence data presented in this study, while the other species are based on ITS sequences only [54]. b) $\pi$ (based on ITS sequences only) for all Saccharomycotina and non-Saccharomycotina that are listed in the ISHAM ITS reference DNA barcoding database [54]. c) non-overlapping $5 \mathrm{~kb}, 10 \mathrm{~kb}$ and 20 kb windows of $\bar{x} \pi$ ( $\pi$ for all sites in the genome divided by window length).

Figure 4. Population genetics of $C$. glabrata sequence types (ST). a) Principalcomponent analysis (PCA) of whole-genome SNPs using SmartPCA revealed little evidence of sub-clustering among STs (isolates are calculated and plotted ndividually, but labelled by their ST alone for clarity). SmartPCA failed to calculate the eigenvalues for some isolates including those belonging to ST4. b) The crossvalidation (CV) error from running unsupervised ADMIXTURE for variant-sites across the $C$. glabrata population, testing K values between 1 and $35 . \mathrm{K}=20$ provided the lowest CV error. c) ADMIXTURE plot for all isolates using $\mathrm{K}=20$, revealing several isolates with evidence of mixed ancestry. Isolates are ordered according to the neighbor-joining tree constructed with PAUP in Figure S1.

Figure 5. Breadth of coverage and depth of coverage across each of the 37 mitochondrial encoded genes for all 151 isolates compared in this study (Each point represents an isolate). A) Breadth of coverage as a \% across each gene. B) The Normalised depth of coverage for each gene (total read depth for each gene / total read depth across both nuclear and mitochondrial genomes). C) Breadth of coverage as a \% across each gene, categorised by sequence types (ST)s. D) Normalised depth of coverage for each gene, categorised by ST.

Figure 6. Microevolutionary changes across seven sets of C. glabrata isolates. A) a RAxML phylogenetic tree of the serial isolates using the general-time-reversible model and CAT rate approximation with 100 bootstrap support. Branch lengths indicate the mean number of changes per site. B) The number of serial mutations total (All), those within protein-coding sequence (CDS), intergenic and intronic regions. C) Those same serial mutations per kb (calculated as the count of serial mutations divided by the total length of the feature (where All = whole genome) and multiplied by 1000). D) Serial mutations within CDS categorized by their effect on the sequencing: Insertion/Deletion (Indel), synonymous mutation (Syn.), nonsynoynmous mutation (Non.Syn.) and nonsense mutation. E) Those same serial mutations within CDS per kb.

Figure S1. Phylogenetic trees of $C$. glabrata. All genomic sites that were either a homozygous reference or SNP in every isolate of $C$. glabrata and $C$. bracarensis AGP [40] for rooting were identified using ECATools and concatenated into a FASTA file. A) A neighbor-joining tree constructed with PAUP. Scale bar indicates the distance based on substitutions per site. B) A maximum likelihood tree constructed using RAxML PThreads v.7.7.8 [39] using the general-time-reversible model and CAT rate approximation with 100 bootstrap support. Branch lengths indicate the mean number of changes per site. The clade according to Carreté L et al. 2018 [24], as well as sequence type (ST), country code (AU = Australia, $\mathrm{BE}=$ Belgium, $\mathrm{DE}=$ Germany, FR = France, GB = Great Britain, IT = Italy, TW = Taiwan, US = United States), MAT and reference are also shown.

Figure S2. Mean $\mathrm{F}_{\text {ST }}$ values from pairwise comparisons of each sequence type (ST) calculated from a) 10 kb non-overlapping windows and b) 5 kb windows. C) Mean $F_{\text {ST }}$ values from 10 kb windows were similar to values calculated from 5 kb windows, with a mean difference of -0.046 per pairwise comparison.

Figure S3. Non-overlapping 10 kb windows showing $F_{S T}$ values for 12 pairwise comparisons that had long genomic regions with lower values.

Figure S4. Five independent runs of ADMIXTURE using $\mathrm{K}=20$ and time-based seed values, revealing several isolates with evidence of mixed ancestry. Isolates are ordered according to the neighbor-joining tree constructed with PAUP in Figure S1.

Figure S5. Non-overlapping 10 kb windows showing normalized depth of coverage (including GC normalization by percentiles; GC, and excluding ambiguous sites (effective window length)).

Figure S6. Integrated Genome Viewer (IGV) screenshots for the reference isolate CBS138, and all isolates compared in this study, indicating substantial differences between our Illumina sequences and the mitochondrial assembly. Gene features are shown as a track (directionality indicated by arrows), and the read alignment from the BAM files are shown for each isolate, where peaks indicate higher depth, and colors on the peaks indicate discrepancies to the reference base: green $=\mathrm{A}$, blue $=$ C, red $=\mathrm{T}$, brown $=\mathrm{G}$, purple $=$ insertion $)$

Table 1. GO-term and PFAM enrichment (two-tailed Fisher exact test with false discovery rate (FDR)-corrected $P$ values $(q)$ of $<0.05)$ for genes with $d N / d S(\omega)>1$, and genes with either microevolutionary frameshifts or non-synonymous mutations across the seven sets of serial isolates. The relative proportion (Rel. prop) was calculated as (number of terms in set 1 / number of terms in set 2 ) * (genes with any terms in set 2 / genes with any terms in set 1 ).

Table 2. Summary of microevolution across seven sets of between 2 and $9 C$. glabrata isolates from recurrent cases of candidiasis. We documented 1,995 mutations between all serial isolates, which were either in protein-coding regions (Coding) or Intergenic and intron regions (Non-coding). Coding mutations were further characterised into Coding Indels, some of which caused frameshifts (Coding Indel (frameshift)), non-synonymous mutations (Coding Non.Syn.), nonsense mutations, (Coding Nonsense), synonymous mutations (Coding Syn.), and bases that reverted back to the ST15 CBS138 reference base (either from a previous microevolutionary change or a pre-existing variant between the initial isolate and the reference ST15 CBS138).

Table 3. Minimum inhibitory concentration (MIC) values of fluconazole for each of the serial isolates.

Table S1. Metadata for clinical Scottish C. glabrata sequenced and analysed in this study.

Table S2. Haploid variant call summary based on alignments to the published nuclear and mitochondrial assembly of ST15 CBS138. These variants form the basis for the population genetic and comparative genomics tests.

Table S3. Diploid variant call summary. Diploid variant calls were used to check for any evidence of heterozygosity suggestive of diploidy. All heterozygous sites (single nucleotide heterozygous positions + heterozygous insertions + heterozygous deletions) amounted to $<0.0404 \%$ ( 0.4 per Kb ) of total positions called per isolate, suggesting these were errors and not evidence of diploidy.

Table S4. Counts of presence/absence (P/A) polymorphisms in each isolate, based on zero reads aligning to the ST15 CBS138 nuclear and mitochondrial genomic regions encoding gene sequences.

Table S5. A summary of $d N / d S(\omega)$ and nonsense mutations found across every gene in isolates representing each of the sequence types (ST).

Table S6. Details of 21 genes (found 67 times across all STs) with $d N / d S(\omega)>1$, which belonged to our set of 129 "genes of interest" including adhesions (e.g. EPA genes), aspartic proteases, phospholipases, cell wall biogenesis, structural wall proteins, regulatory, efflux pumps (all genes in Table 1 of [53]), as well as both FKS and 12 ERG pathway genes.

Table S7. Counts of all microevolutionary changes documented between seven sets of between 2 and $9 C$. glabrata isolates from recurrent cases of candidiasis.

Table S8. Details of 29 genes that had microevolutionary changes documented between seven sets of between 2 and $9 C$. glabrata isolates from recurrent cases of candidiasis, and belonged to our set of 129 "genes of interest" including adhesions (e.g. EPA genes), aspartic proteases, phospholipases, cell wall biogenesis, structural wall proteins, regulatory, efflux pumps (all genes in Table 1 of [53]), as well as both FKS and 12 ERG pathway genes. For each mutation, the information is encoded in a string with details separated by a semi colon. The first detail in variant type (e.g. ref_to_snp, where ref=reference), the second is location in CDS by nucleotide count, the third is the codon position (1, 2 or 3 ), the fourth is codon found along with amino acid position and type. Finally, a short description is given e.g. INSERTION and DELETION along with the number of nucleotides, or SYN=Synonymous, NSY=Non-synonymous, and NON=Nonsense.

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Table 1

## Category

dN/dS>1

| GO/PFAM term | Genes $\omega<1$ | Genes $\omega>1$ | fisher p | $q$ value | Rel. prop | GO/PFAM description |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| GO:0003723 | 428 | 25 | $2.26 \mathrm{E}-04$ | 3.04E-02 | 1.95 | RNA binding |
| GO:0003735 | 152 | 3 | $7.38 \mathrm{E}-05$ | $1.49 \mathrm{E}-02$ | 5.78 | structural constituent of ribosome |
| GO:0003824 | 1745 | 155 | $8.61 \mathrm{E}-05$ | $1.64 \mathrm{E}-02$ | 1.28 | catalytic activity |
| GO:0005515 | 1100 | 81 | $4.48 \mathrm{E}-06$ | $1.41 \mathrm{E}-03$ | 1.55 | protein binding |
| GO:0005740 | 278 | 11 | $5.08 \mathrm{E}-05$ | $1.06 \mathrm{E}-02$ | 2.88 | mitochondrial envelope |
| GO:0005759 | 160 | 4 | $1.90 \mathrm{E}-04$ | $2.65 \mathrm{E}-02$ | 4.56 | mitochondrial matrix |
| GO:0006412 | 287 | 11 | $2.68 \mathrm{E}-05$ | $6.05 \mathrm{E}-03$ | 2.98 | translation |
| GO:0019693 | 100 | 1 | $3.63 \mathrm{E}-04$ | $4.35 \mathrm{E}-02$ | 11.4 | ribose phosphate metabolic process |
| GO:0022626 | 87 | 0 | $1.16 \mathrm{E}-04$ | $1.99 \mathrm{E}-02$ | N/A | cytosolic ribosome |
| GO:0022857 | 277 | 13 | 4.08E-04 | $4.70 \mathrm{E}-02$ | 2.43 | transmembrane transporter activity |
| GO:0036094 | 724 | 52 | $2.58 \mathrm{E}-04$ | 3.31E-02 | 1.59 | small molecule binding |
| GO:0043168 | 689 | 48 | $1.89 \mathrm{E}-04$ | $2.65 \mathrm{E}-02$ | 1.64 | anion binding |
| GO:0044281 | 498 | 27 | $1.57 \mathrm{E}-05$ | $3.86 \mathrm{E}-03$ | 2.1 | small molecule metabolic process |
| GO:0044391 | 143 | 3 | $2.32 \mathrm{E}-04$ | 3.05E-02 | 5.44 | ribosomal subunit |
| GO:0071840 | 1325 | 113 | $2.76 \mathrm{E}-04$ | 3.47E-02 | 1.34 | cellular component organization or biogenesis |
| GO:1901362 | 364 | 19 | $1.92 \mathrm{E}-04$ | $2.65 \mathrm{E}-02$ | 2.18 | organic cyclic compound biosynthetic process |
| PF00624.20 | 4 | 23 | 6.53E-20 | 7.42E-17 | 0.02 | Flocculin repeat |
| PF10528.11 | 12 | 10 | $1.87 \mathrm{E}-05$ | 1.07E-02 | 0.13 | GLEYA domain |
| PF00514.25 | 8 | 8 | $5.72 \mathrm{E}-05$ | 2.17E-02 | 0.11 | Armadillo repeat |


| Microevolution (Frameshift) | GO/PFAM term | Genes without frameshift | Genes with frameshift | fisher $p$ | q value | Rel. <br> prop | GO/PFAM description |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | GO:0009986 | 30 | 9 | $7.53 \mathrm{E}-12$ | 4.26E-08 | 0.03 | cell surface |
|  | GO:0009987 | 3616 | 17 | $1.20 \mathrm{E}-05$ | $3.38 \mathrm{E}-02$ | 1.7 | cellular process |
|  | PF05001.15 | 0 | 17 | 1.10E-39 | 1.25E-36 | 0 | RNA polymerase Rpb1 C-terminal repeat |
|  | PF10528.11 | 13 | 9 | $5.54 \mathrm{E}-15$ | $3.15 \mathrm{E}-12$ | 0.01 | GLEYA domain |
|  | PF00399.21 | 24 | 9 | $4.09 \mathrm{E}-13$ | $1.55 \mathrm{E}-10$ | 0.02 | Yeast PIR protein repeat |
|  | PF08238.14 | 14 | 6 | $2.64 \mathrm{E}-09$ | $7.49 \mathrm{E}-07$ | 0.02 | Sel1 repeat |
|  | PF11765.10 | 6 | 3 | $2.58 \mathrm{E}-05$ | 5.86E-03 | 0.01 | Hyphally regulated cell wall protein N-terminal |
|  | PF09770.11 | 0 | 2 | 4.79E-05 | $9.08 \mathrm{E}-03$ | 0 | Topoisomerase II-associated protein PAT1 |
| Microevolution |  | Genes without | Genes with |  |  |  |  |
| (Nonsynonymous) | GO/PFAM | non- | non- |  |  | Rel. prop |  |
| synonymous) | GO-0009986 | 28 | 11 | $7.88 \mathrm{E}-10$ | 4.45E-06 | $0.06$ |  |
|  | PF10528.11 | 12 | 10 | $3.14 \mathrm{E}-11$ | $3.58 \mathrm{E}-08$ | 0.03 | GLEYA domain |
|  | PF11765.10 | 4 | 5 | $1.03 \mathrm{E}-06$ | 5.87E-04 | 0.02 | Hyphally regulated cell wall protein N-terminal |

without
frameshift frameshift

64E-09
5.86E-03
0.02 Sel1 repeat

Hyphally regulated cell wall protein N-terminal
Topoisomerase II-associated protein PAT1

Genes
without Genes with nonsynonymous

| Case ID | Initial | Relapse | ST | All <br> Mutations | Coding | Noncoding | Coding Indel | Coding Indel (frameshift) | Coding (Non.Syn.) | Coding <br> Nonsense | Coding (Syn.) | Coding (revert to ref.) |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 1 | CG107A | CG107B | 36 | 97 | 83 | 14 | 18 | 9 | 16 | 0 | 17 | 32 |
| 2 | CG18A | CG18B | 10 | 140 | 127 | 13 | 20 | 7 | 24 | 0 | 20 | 63 |
| 3 | CG191A | CG191B | 10 | 64 | 53 | 11 | 13 | 4 | 11 | 0 | 8 | 21 |
| 3 | CG191B | CG191C | 10 | 78 | 66 | 12 | 14 | 9 | 10 | 0 | 8 | 34 |
| 3 | CG191C | CG191D | 10 | 83 | 72 | 11 | 17 | 12 | 14 | 0 | 10 | 31 |
| 3 | CG191D | CG191E | 10 | 96 | 85 | 11 | 14 | 4 | 12 | 0 | 9 | 50 |
| 3 | CG191E | CG191F | 10 | 87 | 77 | 10 | 23 | 16 | 19 | 0 | 17 | 18 |
| 4 | CG48A | CG48F | 7 | 92 | 79 | 13 | 10 | 3 | 11 | 0 | 13 | 45 |
| 5 | CG84F | CG84G | 67 | 76 | 64 | 12 | 17 | 5 | 8 | 0 | 5 | 34 |
| 5 | CG84G | CG84H | 67 | 71 | 59 | 12 | 21 | 5 | 9 | 0 | 3 | 26 |
| 6 | CG93A | CG93B | 162 | 125 | 114 | 11 | 20 | 4 | 15 | 0 | 16 | 63 |
| 6 | CG93B | CG93C | 162 | 119 | 105 | 14 | 23 | 10 | 23 | 0 | 18 | 41 |
| 6 | CG93C | CG93D | 162 | 124 | 110 | 14 | 19 | 7 | 16 | 0 | 9 | 66 |
| 6 | CG93D | CG93E | 162 | 112 | 97 | 15 | 24 | 10 | 20 | 1 | 12 | 40 |
| 6 | CG93E | CG93H | 162 | 119 | 105 | 14 | 21 | 5 | 20 | 0 | 18 | 46 |
| 6 | CG93H | CG931 | 162 | 116 | 102 | 14 | 20 | 6 | 13 | 0 | 14 | 55 |
| 6 | CG93I | CG93J | 162 | 96 | 82 | 14 | 22 | 13 | 13 | 0 | 11 | 36 |
| 6 | CG93J | CG93K | 162 | 135 | 120 | 15 | 21 | 11 | 22 | 1 | 28 | 48 |
| 7 | CG97A | CG97B | 25 | 79 | 66 | 13 | 14 | 3 | 15 | 0 | 10 | 27 |
| 7 | CG97B | CG97C | 25 | 86 | 75 | 11 | 11 | 4 | 12 | 0 | 18 | 34 |

Title: Population genetics and microevolution of clinical Candida glabrata reveals recombinant sequence types and hyper-variation within mitochondrial genomes, virulence genes and drug-targets

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Raw sequences for all isolates of $C$. glabrata from this study have been deposited in the NCBI Sequence Read Archive (SRA) under BioProject PRJNA669061.

Short Running Title: Population genetics of $C$. glabrata
Keywords: Candida glabrata, genome sequencing, epidemiology, candidiasis, microevolution, mitochondria, drug-resistance, evolution.

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#### Abstract

Candida glabrata is the second most common etiological cause of worldwide systemic candidiasis in adult patients. Genome analysis of 68 isolates from 8 hospitals across Scotland, together with 83 global isolates, revealed insights into the population genetics and evolution of $C$. glabrata. Clinical isolates of $C$. glabrata from across Scotland are highly-genetically diverse, including at least 19 separate sequence types (STs) that have been recovered previously in globally diverse locations, and one newly discovered ST. Several STs had evidence for ancestral recombination, suggesting transmission between distinct geographical regions has coincided with genetic exchange arising in new clades. Three isolates were missing MAT $\alpha 1$, potentially representing a second mating type. Signatures of positive selection were identified in every ST including enrichment for Epithelial Adhesins (EPA) thought to facilitate fungal adhesion to human epithelial cells. In patent microevolution was identified from seven sets of recurrent cases of candidiasis, revealing an enrichment for non-synonymous and frameshift indels in cell surface proteins. Microevolution within patients also affected EPA genes, and several genes involved in drug resistance including the ergosterol synthesis gene ERG4 and the echinocandin target $F K S 1 / 2$, the latter coinciding with a marked drop in fluconazole MIC. In addition to nuclear genome diversity, the $C$. glabrata mitochondrial genome was particularly diverse, appearing reduced in size and with fewer conserved protein encoding genes in all non-reference ST15 isolates. Together, this study highlights the genetic diversity present within the C. glabrata population that may impact virulence and drug resistance, and two major mechanisms generating this diversity: microevolution and genetic exchange/recombination.


## Article Summary (80 words)

Candida glabrata is a leading human fungal pathogen worldwide, which is increasing in prevalence and evolving antifungal resistance. Here, we report the largest wholegenome sequencing project for $C$. glabrata to date based on clinically derived candidemia isolates from hospitals across Scotland in the United Kingdom. We discover evidence for a second mating type, evidence for recombination between sequence types, hyper-diverse mitochondrial genomes, signatures of positive selection in pathogenicity genes, and in patient microevolution of drug-resistance genes.

## Introduction

Candida is the most prominent genus of the Debaryomycetaceae family, with over 400 genetically and phenotypically diverse species currently described [1]. Many of these species are harmless commensals of the mucous membranes and digestive tracts of healthy individuals. Approximately 30 Candida species are of clinical importance in humans. Most of these species that are capable of causing disease in humans belong to the CTG-Serine clade, including $C$. albicans, $C$. dubliniensis, C. tropicalis, C. parapsilosis, C. Iusitaniae, C. guilliermondii and C. auris, while others such as $C$. glabrata and $C$. bracarensis belong to the genetically distant Nakaseomyces clade [1,2]. In adult patients, C. glabrata is the second most commonly isolated species after C. albicans, which together cause approximately three quarters of all systemic candidiasis [3,4]. Infections caused by these species range from mild vulvovaginal candidiasis (VVC or thrush) to severe, drug resistant and difficult to treat invasive infections affecting single organs or the blood stream
(candidemia) with or without dissemination to the heart, brain, kidneys and other parts of the body [5]. Bloodstream infections caused by Candida spp. are associated with mortality rates of $30-60 \%$ [6,7]. Candidemia is associated with diverse risk factors including neutropenia, chemotherapy, diabetes, old age, compromised immune function, prolonged antibiotic and steroid treatment, and intravenous catheters that can harbour fungal biofilms [8]. Pathogenic Candida species including C. glabrata have also exhibited alarming increases in resistance against all major classes of antifungal drugs, hindering effective treatments and resulting in increasing mortality rates [4,9-12].
C. glabrata typically grows in the yeast form and is considered to have evolved an infection strategy based on stealth and evasion without causing severe damage in murine models [13]. This ability of $C$. glabrata and some of its relatives in the Nakaseomyces clade to infect humans is thought to have evolved recently [14], as several of its closest relatives have to date been exclusively isolated environmentally (C. castellii, N. baccilisporus, N. delphensis) [14]. Pathogenicity in the Nakaseomyces correlates with the number of Epithelial Adhesins (EPA) encoded in their genomes, which facilitate adherence and colonisation of human epithelial cells [15]. In contrast to $C$. albicans, the pathogenicity of Nakaseomyces species does not coincide with number or presence of Phospholipase-B and Superoxide Dismutase genes [16-19]. Many Candida genes involved in virulence are therefore likely to have diverse functions, some of which may not be conserved between distant clades.

Like many fungal pathogens, C. glabrata's niche(s) and life cycle are poorly understood. C. glabrata is increasingly identified among clinical samples where it is responsible for an increasing proportion of cases of candidemia [4,20]. C. glabrata has also been identified environmentally, including as a component of the mycobiota of yellow-legged gulls [21], in droppings and cloaca swabs of birds of prey, migratory birds and passeriformes [16], and other potentially transitory sources including spontaneously fermenting coffee beans [22]. Concerted efforts for sampling are required to determine the true ecological distribution of $C$. glabrata, as they are for several other important Candida species such as C. auris [23]. Furthermore, the relatedness of global isolates and their routes of transmission (either patient to patient, or between patient and the environment) requires further studies comparing genotypes to collected metadata including location of isolation.

High levels of genetic heterogeneity have been identified in the C. glabrata population, as molecular methods have identified diverse strains, clades and Sequence Types (STs) both inter- and intra-nationally [24,25]. As of January 2022, the Multi Locus Sequence Type (MLST) database for C. glabrata included 233 STs from 1,414 isolates from 29 countries, based on the sequence identity for 6 genetic loci [26]. All isolates of $C$. glabrata reported to date have been haploid, with occasional aneuploids e.g. transitory disomies of chromosomes E and G [24].

Genetic heterogeneity within many fungal populations is shaped by their ability to switch between clonal and sexual recombination [27]. The ability for $C$. glabrata to undergo a sexual cycle remains unknown, with all reported attempts in the laboratory to encourage mating thus far unsuccessful. C. glabrata has therefore
been regarded as an asexual species, despite the presence of well conserved mating loci $[28,29]$ and 14 examples of phylogenetic incompatibilities from multi locus sequencing [30]. More recent genomic analysis from 34 globally isolated $C$. glabrata strains revealed evidence of population admixture, suggesting a thus far undiscovered sexual cycle [24]. Greater sampling efforts and genomic analyses are therefore required to fully explore signatures of adaptation, virulence and recombination.

In this study, we explore the population genetics and microevolution of $C$. glabrata using comparative genomic analysis of 68 clinical $C$. glabrata isolates from 8 hospitals across Scotland, combined with 83 publicly available and globally isolated genomes, finding evidence of recombinant STs, hypervariable mitochondrial genomes, as well as variation in virulence genes and drug-targets between STs and between serial isolates from prolonged or recurrent infection.

## Materials and Methods

## Library preparation, sequencing and antifungal tests

Candida glabrata was collected from blood in 2012 from eight hospitals in Scotland (Table S1). These isolates were collected as part of a retrospective study of all cases of Candida blood stream infections carried out within Scotland under NHS Caldicott Guardian approval from March 2012 to February 2013, as described previously [4,31].

Genomic and mitochondrial DNA was extracted from 68 isolates using the QIAamp® DNA mini extraction kit (Qiagen) according to the manufacturer's
instructions. A small modification was made prior to extraction which was to mechanical disrupt the yeast. This was achieved by bead-beating the cells with sterile acid-washed 0.5 mm diameter glass beads (Thistle Scientific) for $3 \times 30 \mathrm{~s}$. Following isolation and extraction using the QIAamp columns the DNA was eluted into elution buffer before storage at $-20^{\circ} \mathrm{C}$ and transport to the sequencing facility.

Library preparation was performed by the Centre for Genome-Enabled Biology and Medicine at the University of Aberdeen. Briefly, gDNA quality was assessed on a Tapestation 4200 with a high sensitivity genomic DNA tape (Agilent) and quantified by fluorimetry using Quant-IT dsDNA High-sensitivity (HS) assay (Thermo Fisher). Dual indexed Illumina libraries were prepared from 1 ng purified gDNA using an Illumina Nextera XT DNA library preparation kit and Nextera XT v2 indices, which were purified from free adapters using AMPure XP beads (Beckman Coulter). Libraries were quantified using Quant-IT dsDNA High-sensitivity (HS) assay (Thermo Fisher) and average fragment size was calculated on Tapestation 4200 (Agilent), then equimolar pooled at 10 nM . Concentration of the pool was verified by qPCR (Kapa library quantification kit, Roche) on QuantStudio 6 using SYBR green, and 1.8 pM of the library pool was sequenced on an Illumina NextSeq500 with 150bp paired end reads and 8bp index reads to average alignment depths of 41.9X (Table S2). This data was supplemented with paired end Illumina reads from Carreté et al. [24], and isolate CBS138 from Xu et al. [32].

Minimum inhibitory concentration (MIC) tests for fluconazole were performed at the Mycology Reference Laboratory, Public Health England, Bristol, according to
standard Clinical and Laboratory Standards Institute (CLSI) broth microdilution M27 guidelines [33].

## Variant calling

The Genome Analysis Toolkit (GATK) v.4.1.2.0 [34] was used to call variants. Our Workflow Description Language (WDL) scripts were executed by Cromwell workflow execution engine v. 48 [35]. Briefly, raw sequences were pre-processed by mapping reads to the reference genome C. glabrata CBS138 using BWA-MEM v.0.7.17 [36]. Next, duplicates were marked, and the resulting file was sorted by coordinate order. Intervals were created using a custom bash script allowing parallel analysis of large batches of genomics data. Using the scatter-gather approach, HaplotypeCaller was executed in GVCF mode with the haploid ploidy flag. Variants were imported to GATK 4 GenomicsDB and hard filtered if QualByDepth (QD) < 2.0, FisherStrand (FS) >60.0, root mean square mapping quality (MQ) < 40.0, Genotype Quality $(G Q) \geq 50$, Allele Depth $(A D) \geq 0.8$, or Coverage (DP) $\geq 10$.

To identify aneuploid chromosomes, depth of coverage was calculated for each of 206 fungal samples. Sorted BAM files prepared in the pre-processing phase of SNP calling were passed to Samtools v.1.2 [37] and mpileup files were generated. Read depth was normalised by total alignment depth and plotted against the location in the genome using 10 kb non-overlapping sliding windows. To identify structural variation, assembly de novo was achieved using Spades v3.12 [38] using default parameters.

## Phylogenetic and population genetic analysis

To construct species-specific phylogenetic trees, all sites that were either a homozygous reference or SNP in every isolate were identified using ECATools (https://github.com/rhysf/ECATools) and concatenated into a FASTA file. Our rooted tree C. bracarensis included 1,198 phylogenetically informative sites, while the unrooted C. glabrata tree included 34,980 phylogenetically informative sites. Phylogenetic trees were constructed with RAxML PThreads v.7.7.8 [39] using the general-time-reversible model and CAT rate approximation with 100 bootstrap support, both with rooting to $C$. bracarensis AGP [40] or midpoint rooting without $C$. bracarensis. We constructed a tree using the same models with 1000 bootstrap support for all Saccharomycetaceae species that had a genome assembly in NCBI or JGI Mycocosm. We also constructed neighbour-joining trees using PAUP v4.0b10 [41] and a NeighborNet Network with SplitsTree v.4.15.1 [42]. Trees were visualised using FigTree v. 1.4.4 (http://tree.bio.ed.ac.uk/software/figtree/).

A multisample variant call format (VCF) corresponding to all 151 genomes was made with VCFTools v0.1.12 vcf-merge [43] and converted to ped and map file formats for use in PLINK v1.90 [44]. VCFTools was used to calculate genetic diversity metric pi, using the --site-pi parameter. Unsupervised ADMIXTURE [45] (settings: --haploid="*" -s time) was run on a moderately linkage disequilibrium (LD)pruned alignment (PLINK --indep-pairwise 60100.1 ) for values of $K$ between 1 and 35. A value of $K=20$ provided the lowest cross-validation error. Principle component analysis was performed using SmartPCA v4 [46]. Consensus gene sequences for each isolate were generated, and genes FKS2 (CAGLOK04037g) positions 240-828, LEU2 (CAGL0H03795g), NMT1 (CAGL0A04059g), TRP1 (CAGL0C04092g), UGP1 (CAGLOL01925g), and URA3 (CAGLOIO3080g) were used to identify known MLST
for each of the isolates, and confirm that isolate CG57 was an unknown MLST and registered as the new ST204 on PubMLST (https://pubmlst.org/organisms/candidaglabrata) [47].

We applied Weir's estimator [48] of Wright's Fixation Index $\left(F_{S T}\right)$ according to the equations given in Multilocus 1.3 [49] using non-overlapping sliding windows. The scripts have been made available online (https://github.com/rhysf/FSTwindows).

## Selection and microevolutionary analysis

The direction and magnitude of natural selection for each ST were assessed by measuring the rates of non-synonymous substitution $(d N)$, synonymous substitution $(d S)$ and omega ( $\omega=d N / d S$ ) using the yn00 program of PAML [50], which implements the Yang and Nielsen method, taking into account codon bias [51]. Further GC corrections were not applied. The program was run on every gene in each isolate using the standard nuclear code translation table. To examine the functional significance of genes with $\omega>1$, we evaluated their Pfam domains and Gene Ontology (GO) terms for statistical enrichment (genes with $\omega>1$ vs, the remaining genes) using the two-tailed Fisher exact test with Storey false discovery rate (FDR)-corrected $P$ values (q) of $<0.05$. GO Terms were acquired using Blast2Go v6.0.1 [52] using Blastp-fast to the NCBI BLAST nr-database (E-value < 1E-5).

Genes of interest were defined including both FKS and 12 ERG pathway genes, as well as all genes listed in Table 1 of [53], which included adhesions including EPA genes, aspartic proteases, phospholipases, cell wall biogenesis,
structural wall proteins, regulatory, efflux pumps. This gene list was then screened for genes with either signatures of positive selection, or those undergoing microevolutionary changes (non-synonymous and frameshift indels).

## Results

## Recombinant sequence types in Scottish clinical samples

Clinical isolates of Candida glabrata from across Scotland are highlygenetically diverse. Using whole-genome sequencing, we analysed the genomes for 68 isolates of $C$. glabrata from 47 separate patients across eight Scottish hospitals, generating the largest panel of $C$. glabrata genome sequences to date. These 68 isolates belonged to twenty separate sequence-types (ST) of C. glabrata, which represent genetically related sub-populations based on alleles from six loci/genes. One isolate (CG57 from a single patient in Forth Valley Royal Hospital) belonged to a new ST that has not been previously identified anywhere else (ST204) (Fig. 1, Table S1, Table S2). Variant calling using the diploid model of GATK found few examples of heterozygosity (< 0.41 per kb for every isolate) suggesting all isolates were haploid (Table S3). Our panel of C. glabrata isolates was supplemented with a further 83 genomes from three recent studies of global C. glabrata isolates [24,25,32], as well as sequences from the outgroup C. bracarensis [40], which has also been identified from clinical settings and is the closest known relative of $C$. glabrata [14].

Phylogenetic analysis of our Scottish collection along with the worldwide $C$. glabrata isolates revealed high genetic diversity among the 29 separate STs represented by our combined panel (Fig. 2, Fig. S1). Allelic diversity among $C$.
glabrata isolates (mean nucleotide diversity $(\pi)=0.00665, \sigma=0.047$ ) was higher than previously reported ( $\pi=0.00485$ based on the Internal Transcribed Spacer (ITS) of 29 strains [54]). Our WGS-based calculation of $C$. glabrata $\pi$ was the highest of any species in the Saccharomycetaceae that had both an available genome assembly and a calculation of $\pi$ (albeit those are based on ITS sequences and fewer strains than we had) [54] (Fig. 3a). However, C. glabrata genetic diversity was typical among the Saccharomycotina (mean $/ \bar{x}=0.0055$, median $=0.0039$, standard deviaton $/ \sigma=0.0055$ ) (Fig. 3b). Nucleotide diversity within the population was present across the nuclear genome (Fig. 3c), with window length having some impact on the result (smaller window lengths (5 kb) resulted in higher average $\pi$ in approximately half of the genome: chromosomes A-F, M and H). Most of the allelic diversity across the 151 C. glabrata isolates came from the nuclear genome ( $\mathrm{min} .=$ 0.09 SNPs / kb, max. $=6.54$ SNPs $/ \mathrm{kb}, \overline{\mathrm{x}}=5.55$ SNPs $/ \mathrm{kb}$ ) compared with the mitochondrial genome (min. $=0.05$ SNPs $/ \mathrm{kb}, \max .=3.64 \mathrm{SNPs} / \mathrm{kb}, \overline{\mathrm{x}}=1.21$ SNPs / kb). Indeed, a significant difference between nuclear SNPs / kb and mitochondrial SNPs / kb was found using a two-tailed $t$-test for all 151 genomes ( $p=$ 5.6147E-111).

Seven clade (C) delineations for C. glabrata were recently proposed [24], which were equivalent to pre-existing STs including C1 (ST19), C2 (ST7), C3 (ST8), C 4 (ST22), C6 (ST136) and C7 (ST3). We found that C5 was polyphyletic, encompassing isolates belonging to the genetically divergent ST6, ST10 and ST15 (Fig. S1). Therefore, we recommend the use of ST delineations rather than those clade delineations.

Several C. glabrata STs had evidence of genetic recombination. Our neighbour-net network tree of all isolates suggested historic gene-flow between several STs including for example ST7, ST55 and ST162 (Fig. 2). Genomic regions with low Wright's fixation index $\left(F_{S T}\right)$ values, consistent with genetic exchange, were also identified from pairwise comparisons $(n=435)$ across 5 kb and 10 kb nonoverlapping windows of all STs (Fig. S2). $x F_{S T}$ values calculated from 5 kb windows were slightly lower than those calculated from 10 kb windows (averaging -0.046 for each ST pairwise comparison), indicating that window length impacts this measure of genetic variation. Twelve pairwise comparisons from 10 kb windows had $F_{S T}<0.9$ across the genome (Fig. S3), with the lowest for ST18 and ST26 ( $F_{S T}=0.64$ ). Additionally, ST7, ST55 and ST162 had lower $F_{S T}$ values across the genome ( $F_{S T}=$ 0.65-0.83) than other pairwise comparisons demonstrating incompatible phylogenetic signals between these STs (Fig. S2).

Principal-component analysis (PCA) of whole-genome SNPs revealed little evidence of clustering of several C. glabrata STs, which is consistent with gene flow between them (Fig. 4A). For unsupervised model-based clustering with ADMIXTURE, we first identified that $K=20$ had the lowest cross-validation error (Fig. 4B), and was therefore used for subsequent analysis. Two isolates were consistently ( 6 independent Admixture runs) found to have evidence for mixed ancestry: ST177 CG1 and our newly discovered ST204 CG57 (Fig. 4C, Fig. S4). Other isolates were found to have evidence of mixed ancestry in the majority of runs including ST124 WM18.66, ST126 WM05.155 and ST8 M17.

Only one of the Scottish isolates (CG46) had evidence for Chromosome Copy Number Variation (CCNV)/aneuploidy, found in Chromosome C (Fig. S5). Distributions of normalised chromosome read depths of chromosome C (average depth per 10 kb window $=0.68$ ) differ significantly from the rest of the genome of CG46 (average depth per 10kb window $=1.05$; Kolmogorov-Smirnov Test: $p=$ $2.09 \mathrm{E}-25)$, with coverages of chromosome C significantly lower than in the rest of the genome (Wilcoxon rank-sum test: $p=1.353 E-25$ ). No other CCNVs were found, despite many isolates having been treated with antifungals that have previously been correlated with CCNV [55]. Together, these results suggest occasional genetic recombination within the C. glabrata population, without an association with aneuploidy.

Mating types and mating type switching are poorly understood in C. glabrata, although it is thought that Mating-type regulatory protein $\alpha 2$ is expressed in all MTL $\alpha$ strains and not in MTLa strains [56,57]. MAT 2 (CAGL0B01265g) was present in all Scottish isolates (breadth of coverage; BOC $>87 \%$ ). However, MAT $\alpha 1$ appeared to be absent or partially absent in 3/9 ST6 isolates (CG12 $=16 \%$ BOC, CG121 $=18 \%$ BOC, CG42 $=12.5 \%$ BOC), while present in the remaining six ST6 isolates, and all the other STs (BOC 100\%). The functional relevance of MAT $\alpha 1$ deletion or truncation is unclear but may be a hallmark of the rarer of the two mating types.

## Hyper-variable mitochondrial genomes among sequence types

$F_{S T}$ analysis highlighted the mitochondrial genome of $C$. glabrata as hypervariable (Table S2, Fig. S6). Forty-three genes were identified in $\geq 10$ pairwise $F_{S T}$ comparisons, including all eleven mitochondrial protein encoding genes. To explain
this enrichment of low $F_{S T}$ mitochondrial genes, we studied the 151 genome alignments. While the nuclear genome had 97.3-99.4\% BOC, the mitochondrial genome had 20.4-99.9\% BOC, with 42\% of isolates ( $n=63 / 151$ ) containing $>10 \%$ ambiguous mitochondrial bases (2 kb) (Table S2) (here, we define ambiguous as sites with too few reads aligning to be called by GATK, or reads that cannot be called by GATK due to not passing variant filtration). Surprisingly, a pattern of low and/or patchy read coverage was identified in every isolate including the ST15 reference isolate CBS138 (Fig. S6), indicating that the reference mitochondrial sequence assembly [58] may have a high error rate, and given additional differences identified in non-reference isolates, that $C$. glabrata mitochondrial genomes are highly heterogenous.

The mitochondrial genome for some C. glabrata isolates appears reduced in size and encodes fewer protein encoding genes (Fig. 5). As many as 22/37 (59\%) mitochondrial encoded genes were entirely absent in at least one isolate, including Cg1, Cg1II, and Cg1III (putative endonucleases of exons and introns in the mitochondrial COX1 gene), ATP8 and ATP9 (subunits 8 and 9 of the enzyme complex required for ATP synthesis), RPM1/RPR1 (RNA component of mitochondrial RNAse P), VAR1 (putative mitochondrial ribosomal protein of the small subunit, ) and most of the tRNA genes (15/23). Nine separate STs had absent mitochondrial genes. Normalised depth of coverage was variable across the genes, with $<1$ average normalised depth across all isolates for $\mathrm{Cg} 1, \mathrm{Cg} 1 \mathrm{II}$, and Cg 1 III , ATP8, RPM1, VAR1 and tRNA-Met1. While non-uniform coverage in terms of depth and breadth was found across all mitochondrial genomes belonging to all datasets, our newly sequenced isolates have the lowest mean breadth across mitochondrial
genes $(\bar{x}=92.18, \sigma=20.07)$ compared with Biswas et al. $[25](\bar{x}=98.48, \sigma=11.47)$ and Carreté et al. [55] ( $\bar{x}=97.03, \sigma=14.11$ ), suggesting there are some discrepancies between library preparation impacting mitochondrial read sequencing. Notably, only $1 / 50$ Biswas et al. [25] isolates (WM03.450) had entirely absent mitochondrial genes compared with 8/32 Carreté et al. [55] isolates and 15/68 of our newly sequence isolates. Total sequencing depth can be ruled out as the main cause for low mitochondrial coverage, given Carreté et al. [55] had the highest sequencing depth ( $\bar{x}=360 X$ ) and had many isolates with absent mitochondrial genes, compared with Biswas et al. [25] ( $\overline{\mathrm{x}}=74 \mathrm{X}$ ) and ours ( $\overline{\mathrm{x}}=42 \mathrm{X}$ ).

We used assembly de novo to further explore the mitochondrial sequence for isolate WM03.450 (ST83), which had the greatest number of ambiguous bases across its mitochondrial genome (16 kb / 80\%). Our WM03.450 Illumina-based assembly ( 12.9 Mb ; N.contigs $=\sim 3$ thousand; $\mathrm{N}_{50}=85 \mathrm{~kb}$ ) is 562 kb longer than the CBS138 reference sequence, indicating substantial genomic differences between these isolates and STs. Aligning our assembly to the reference CBS138 mitochondrial genome using Blastn identified 10 contig matches with a combined alignment length of only 1.9 kb (mean 157 nt per contig), suggesting the low alignment is not due to conserved nucleotide sequences that have undergone large rearrangements. Aligning the assembly to the eleven mitochondrial protein sequences using Blastx identified only $6 / 11$ genes across six separate contigs, four of which were < 364 nt length, and two that are 10.4 kb and 81.5 kb . Conversely, assembly de novo and Blastx of our Illumina reads for the reference isolate CBS138 against the published CBS138 genome identified all eleven mitochondrial genes present on four contigs, with 18.9 kb total sequence length, of which Blastn aligned

# 9.3 kb to the published mitochondrial assembly. Together, these analyses suggest that whole gene deletions in the $C$. glabrata mitochondria are common. 

## Signatures of selection identified among sequence types

In contrast to the C. glabrata mitochondrial genome, we found that gene deletions in the nuclear genome are rare. Indeed, fewer than six presence/absence (P/A) polymorphisms (strictly defined as zero reads aligning) were identified per isolate ( $\sim 0.1 \%$ of 5,210 protein-encoding genes) (Table S4). Of these, two consecutive nuclear-encoded genes (CAGLOA02255g and CAGL0A02277g) on Chromosome A were entirely absent of read coverage in 25 out of the 68 Scottish isolates (37\%), which included all representatives of eleven separate STs (ST4, 7, 8, $24,25,55,67,83,177$, and our newly described 204). These STs do not cluster phylogenetically, ruling out a single evolutionary event causing this deletion. The two genes have identical nucleotide sequences and encode the same amino acid sequence, which is conserved across a range of other Ascomycota species, as well as having sequence similarity to the K62 Killer Preprotoxin protein encoded by the Saccharomyces paradoxus L-A virus M62 satellite (BLASTp E-value $=1 \mathrm{e}-36$ ), suggesting a possible viral origin. CAGL0F09273g is a separate, putative adhesinlike protein (adhesin cluster V ) with a "hyphally regulated cell wall protein N -terminal" PFAM that is lost in eleven isolates including all ST4 (CG68A, CG77), four ST7 (CG157, CG48A, CG48F, CG78), three ST8 (CG127, CG52, CG82), ST19 CG119, ST24 CG166 and ST147 CG133. Again, this gene must have been lost multiple times, given its presence in several ST7 and ST8 isolates. This gene is the last gene on Chromosome $F$, has an $\pi=0.00244$, which is lower than the overall average across the genome, and has previously been reported to undergo CCNV within serial
clinical isolates [55], suggesting it is able to undergo variation within microevolutionary timescales, which may impact the adhesive ability of these $C$. glabrata isolates.

Between 61 and 85 genes with a signature of positive selection $(d N / d S=\omega$, and $\omega>1$ [59]) were found in each ST apart from the reference ST (ST15 CG151), for which only a single gene with $\omega>1$ ( $\omega=1.0019$ ) was identified (Table S5). Apart from the reference ST, STs had between 4 and 14 genes with $\omega>2$, showing stronger signatures of diversifying or positive selection. Of the 2,083 total genes with $\omega>1$ across all clades, 608 were unique genes ( $11.6 \%$ of all genes) i.e., they had this signature in multiple clades, owing to either ancestry or selection acting on the same gene families. To explore selection, we took an unbiased approach using PFAM and GO-term enrichment comparing the numbers of each term in those 608 genes compared with the remaining non-selected genes, as well as a targeted approach for genes of interest (see Methods Selection and microevolutionary analysis) including adhesins, proteases, efflux pumps, FKS, and ERG pathway genes.

Genes with signatures of positive selection within the C. glabrata population targets diverse genes and gene functions. Our unbiased approach for enrichment of functional domains in 608 gene products with signatures of positive selection identified only three significantly enriched (two-tailed Fisher exact test with false discovery rate (FDR)-corrected p-values (q) of < 0.05) PFAM domains and 16 GO terms (Table 1). The enriched PFAM domains were 1) Flocculin repeat (PF00624.20; $q=7.42 \mathrm{E}-17), 2$ ) GLEYA domain (PF10528.11; $q=0.01$ ) and 3) Armadillo repeat
(PF00514.25; $q=0.02$ ). Flocculin is a sub-telomeric gene family involved in flocculation or cell aggregation in S. cerevisiae [60], while GLEYA domains are present in C. glabrata EPA proteins. Thirty Flocculin PFAM domains were assigned to only six genes in C. glabrata, two of which have $\omega>1$ : CAGLOIO7293g and CAGLOIO0220g, and together account for 23/30 Flocculin repeat PFAMs. Enriched GO-terms covered a range of possible biological functions including ribosomal/RNAbinding and mitochondrial structural proteins.

Our targeted approach highlighted 21/129 genes of interest that have $\omega>1$, with at least one found in every ST apart from the reference ST15 and ST46 (Table S6). Notably, none of the aspartic proteases, phospholipases, cell wall biogenesis, efflux pumps, ergosterol biosynthesis pathway genes or FKS genes were found to have hallmarks of positive selection, implying these are conserved within the population. Several genes with $\omega>1$ were found in multiple STs, including adhesive protein CAGLOJ01727g (adhesin cluster VI ) that is under positive selection in seven STs (18, 26, 36, 45, 147, 177, 204) and adhesive protein CAGLOIO7293g (adhesin cluster V ) under positive selection in seven mostly distinct STs (3, 8, 25, 83, 123, 136, 177). C. glabrata encodes 17 putative adhesive proteins without $N$-terminal signal peptides, casting doubt on their role in adhesion. One of these is a pseudogene (CAGLOE00110g) with $\omega>1$ in $13 / 29$ STs. The structural cell wall protein AWP7 belonging to the Srp1p/Tip1p family was under selection in 7 STs.

## C. glabrata nosocomial in-patient microevolution targets pathogenicity factors and drug targets

Our Scottish C. glabrata panel included seven sets of between 2 and 9 isolates from recurrent cases of candidiasis. To explore the microevolution of $C$. glabrata within a human host, and the effects of antifungal treatment (fluconazole, nystatin, and posaconazole) on fungal genetics, we documented all genetic changes between serial isolates (Table 2, Table S7). Although exact dates of isolation were not documented, phylogenetic analysis (Fig. S1, Fig. 6) confirmed these serial isolates were highly related, with between 64 and 140 mutations $\left(1.13468 \times 10^{-5}\right.$ per base pair) identified between pairs of serial isolates (Fig. 6). While the mutation rate or generation time for $C$. glabrata is not known [55], this small number of mutations likely suggests recent clonal origins appropriate for microevolutionary analysis. Serial isolates had an estimated time between isolation (based on blood culture dates) between 0 and 239 days (mean 15 days). Five serial isolates from 4 separate patients/cases showed MIC changes from the earlier sampled isolate (Table 3), including 2 increases (CG107A->B +8 ug/mL, CG97B->C $+4 \mathrm{ug} / \mathrm{mL}$ ), 1 decrease (CG84G->H -4 ug/mL,) and 1 large transient increase (CG93A, B, C, D, E = $4 \mathrm{ug} / \mathrm{mL}$; CG93H, I, K >64 ug/mL, CG93K = $4 \mathrm{ug} / \mathrm{mL}$ ).

Mutations identified between serial isolates were mostly in protein coding sequence (CDS) regions (between 53 and 127 mutations per pairs of serial isolates, collectively adding up to $1,741 / 1,995$ total mutations $=87 \%$ ), despite protein-coding regions taking up only 7.9 / 12.3 Mb (64\%) (Fig. 6B, 6C). The remaining serial mutations were within intergenic regions (236 mutations; 12\%) and intronic regions (18 mutations; 1\%). Intronic regions had the highest count of serial mutations after accounting for the total sequence in introns (Fig. 6C), albeit with $\leq 3$ found per pair of serial isolates. Hypergeometric tests revealed that the number of mutations in coding
sequence compared with non-coding sequence was higher than expected by chance, suggesting a highly significant enrichment of mutations in protein coding genes $(p=3 e-120)$.

To explore the 1,741 microevolutionary changes within coding regions, we categorised them into five groups of newly arising mutations (regardless of prior state): 1 ) insertions/deletions (indels) ( $n=362 ; 21 \%$ ), 2) synonymous mutations ( $n=$ $264 ; 15 \%)$, 3) non-synonymous mutations ( $n=303,17 \%$ ), 4) nonsense mutations ( $n$ $=2$ ), and 5) reversion back to reference base ( $n=810 ; 47 \%$ ). Of the indels, $147 / 362$ ( $41 \%$ ) were frameshifts that disrupted 54 genes. Non-synonymous mutations were detected in 139 genes (Fig. 6D, 6E).

Enrichment for PFAM/GO-terms of these genes with frameshift and nonsynonymous mutations (two-tailed Fisher exact test with false discovery rate (FDR)corrected $p$ values $(q)$ of $<0.05)$ revealed three enriched GO-terms and eight enriched terms (Table 1). Both categories (frameshifts and non-synonymous mutations) were enriched for GO:0009986 Cell Surface ( $q=3.21 \mathrm{E}-08$ and 1.09E-06, respectively), suggesting that $C$. glabrata undergoes rapid mutations in several of its cell surface proteins during prolonged/serial blood stream infections. Enriched PFAM terms included the "RNA polymerase RPB1 C-terminal repeat" for genes with frameshift indels ( $q=1.25 \mathrm{E}-36$ ), GLEYA domains for genes with either frameshift ( $q$ $=3.15 \mathrm{E}-12$ ) or non-synonymous mutations ( $q=3.58 \mathrm{E}-08$ ). Several repeat associated PFAMs and the "Hyphally regulated cell wall protein N-terminal" domain were enriched for non-synonymous mutations ( $q=5.87 \mathrm{E}-04$ ).

Several genes of interest (see Methods: Selection and microevolutionary analysis) had microevolutionary changes ( $n=29 / 129$ ) (Table S8). Notably, one of the two newly acquired nonsense mutations was identified in FKS2 (Case $6 \mathrm{~J}->\mathrm{K}$ ), coinciding with a substantial drop in fluconazole MIC (Table 3). The other was in the uncharacterised CAGLOK04631g at an earlier time point in the same patient (Case 6 D->E).

Twenty adhesins including EPA genes were mutated between serial isolates, including in all seven sets/cases of isolates and at every time point. For example, EPA3 had 5 indels in Case $1(A->B)$, a synonymous mutation in Case $2(A->B$; nucleotide position (pos.) 2304), Case 3 (D->E; pos. 1539), Case 4 (A->F; pos. 1119), Case 5 (F->G; pos. 2259), a non-synonymous mutation (pos. 2224) and large (30nt) insertion in Case 5 (G->H), two large deletions (42nt and 16nt), and two synonymous and one non-synonymous mutations in Case 6 (A->B; pos. 1002, 2319 and 2276 respectively).

The longer 42nt deletion from Case 6 (A->B) reverts back to reference in Case 6 (B->C), suggesting either a) a non-descendent isolate (intra-host variation), b) a false negative reference in 6 C or c ) a false positive deletion in 6 A . The same 42nt deletion, along with a new insertion at the site of the previous synonymous mutation appears in Case 6 (C->D), thereby suggesting the variant is real and option c less likely. That 42nt deletion reverts back to reference in Case 6 (D->E), and appears again in Case $6(\mathrm{E}->\mathrm{H})$. By Case $6(\mathrm{H}->\mathrm{I})$, the gene has a new synonymous mutation, and in Case $6(\mathrm{l}->\mathrm{J})$ it has accumulated a new 15 nt deletion. EPA3 is therefore a hot-spot of variation. Another EPA gene that accumulated a large
number of mutations was AWP12, which accumulated five non-synonymous mutations and one synonymous mutation (Case $6 \mathrm{H}->\mathrm{I}$ ).

Other genes that had accumulated mutations between serial isolates included those encoding an aspartic protease YPS5, several structural wall proteins belonging to the Srp1/Tip family, regulatory protein PDR1, the ergosterol synthesis gene ERG4 (a non-synonymous mutation in Case 3A->B), and both FKS1 and FKS2. Therefore, C. glabrata genes that are antifungal targets and gene families involved in drugresistance and pathogenicity can therefore undergo rapid mutation within a human host.

## Discussion

In this study, we sequenced and analysed the largest panel of $C$. glabrata genomes to date. These isolates were collected from blood-stream infections of patients at several Scottish hospitals in 2012. Our 68 genomes were analysed alongside 83 further publicly available and globally isolated genomes [25,32,55], revealing greater genetic diversity than previously recognised, including a nucleotide diversity of 0.00665 , which is much higher than has been calculated for the distantly related C. albicans at 0.00298 [54]. Surprisingly, we found that only one of our Scottish isolates had evidence of aneuploidy, despite many having been treated with antifungals, which has previously been correlated [55]. Chromosome C in CG46 had lower depth of coverage compared with the rest of the genome, perhaps due to chromosome loss in a subset of cells. The patient that CG46 was isolated from was initially treated with Fluconazole. Following resistance to Fluconazole being
detected, the patient was subsequently treated with Caspofungin, suggesting a potential link between those antifungal treatments and the observed aneuploidy.

We found that the mitochondrial genome of $C$. glabrata was hyper-diverse compared with its nuclear genome for many isolates, including several long deletions spanning one or more genes, with the potential to impact many important biological functions including drug resistance and persistence [61]. High levels of variation in mitochondrial genomes within the major fungal phyla have previously been noted in terms of gene order, genome size, composition of intergenic regions, presence of repeats, introns, associated ORFs, and evidence for mitochondrial recombination in all fungal phyla [62]. This variation is lacking in Metazoa [62]. Our results suggest some of these types of mitochondrial genetic diversity are likely present within the $C$. glabrata population.

Isolates in this study belonged to twenty-nine separate sequence types (STs) of $C$. glabrata, each of which was separated by large number of variants. However, as many as 193 MLST STs have been documented [47]. Therefore, it is likely that the true genetic diversity of $C$. glabrata is much higher than we have been able to calculate with whole-genome sequences (albeit the largest panel studied to date). Indeed, several further STs may yield further evidence of recombination or lack of, and may ultimately require a new effort to group STs into lineages (also dependent on the frequency of recombination that erode these divisions). The genetic diversity of $C$. glabrata in hospitals around Scotland is extremely high, with representatives from 20 STs. Such high genetic diversity (and many of the same STs) have also been found from genome sequencing and phylogenetic analysis of isolates collected
in other countries such as Australia [25], suggesting they must have been transported across or between continents, perhaps by anthropogenic or even natural means (for example its association with birds [16,21] and food [22]). Greater sampling and genotyping of clinical and environmental isolates will be required for understanding ancestry or endemicity.
C. glabrata has long been regarded as a haploid asexual yeast, although evidence has recently emerged of a cryptic sexual cycle [28-30]. Our genome sequencing and population genetics supports this work, revealing compelling evidence that at least 12 sequence types (STs) stem from recombination between other STs. However, further work remains to document and describe individual recombinant isolates. Providing genetic recombination between isolates is naturally occurring, the mechanisms of genetic exchange are also unknown, although likely relate to the conserved mating type locus, which play a central role in the sexual cycle of diverse fungi [63]. Here, we show that the MAT $\alpha 1$ gene was absent or partially absent in three isolates belonging to ST6, which could potentially impact or even be a hallmark of a rarer second mating type of $C$. glabrata. Together, genetic recombination among C. glabrata isolates appears much more common than previously recognised, and likely contributes to increased genetic diversity.

The nuclear genome for isolates belonging to every ST (apart from the reference ST15 that was included as a control) included evidence of positive or diversifying selection. Signatures of positive selection were found enriched in genes with diverse functions, including several with repeat domains, as well as EPA genes with GLEYA domains. EPA genes are a large sub-telomeric family of virulence-
related surface glycoprotein-encoding genes encoded by several other pathogens including Plasmodium, Trypanosoma, and Pneumocystis [64]. Such gene differences between STs of $C$. glabrata may result in clinically-relevant phenotypic differences.

In host microevolutionary changes between serial isolates were enriched within coding-sequences, which is a surprise, given the expectation for intergenic regions to be more permissive to mutations due to relaxed selection within intergenic regions and purifying selection within coding sequence. The reason for this abundance of serial mutations in coding sequence is unclear, although it could potentially be technical (e.g. false negative variants within repetitive sequences) or biological (e.g. drug exposure and host immune pressure). Alternatively, enriched mutations in genes could potentially be driven by processes such as DNA polymerase induced mutations, or differences in chromatin states (e.g. heterochromatin could lead to increased exposure to DNA damaging agents resulting in higher mutation rates, or conversely, greater surveillance and correction of mutations in euchromatin regions by cellular DNA repair enzymes [65]).

Selection may explain why we identified similar numbers of non-synonymous mutations to synonymous mutations, given random mutations are expected to be non-synonymous in $\sim 2 / 3$ nucleotides of each codon. Furthermore, accumulations of deleterious mutations could be occurring in the serial isolates due to small population sizes, although population size estimates could not be calculated accurately from the metadata.

Genes with GLEYA domains including EPA genes were significantly enriched for frameshift and non-synonymous mutations in the coding sequence between serial isolates. Combined with our finding of positive selection in EPA genes across STs, suggests that EPA genes are undergoing variation at both longer time frames and microevolutionary time-scales.

Genes encoding several important drug-targets also underwent mutations between serial isolates, including a non-synonymous mutation in the ergosterol biosynthesis pathway gene ERG4, and a nonsense mutation in the $1,3-\beta$-glucan synthase component FKS2 (mutations in these genes can confer resistance to azoles [66] and echinocandins [67] respectively). Indeed, the nonsense mutation in FKS2 coincided with a marked drop in fluconazole MIC for isolate CG93K, suggesting a possible link.

Our study highlights the need for further sampling and genomic analysis of $C$. glabrata in order to better inform the population structure and mechanisms underlying its increasing emergence, pathogenicity and multi-drug resistance. While we have largely focused on differences among the conserved regions of the $C$. glabrata ST15 CBS138 genome using an alignment-based strategy, our discoveries of a hyper-diverse mitochondrial sequence highlight the value for future long-read sequencing and assemblies to characterise the pan-genomes of C. glabrata and structural genomic diversity that exists among and perhaps within STs, and to explore the mechanisms driving those changes. Furthermore, given the genetic diversity between STs that we document, it would likely be valuable to sequence and assemble additional high-quality reference sequences for the purposes of increasing
variant-calling accuracy and quantifying gene content between different STs. Given the low and patchy alignment depth across the ST15 CBS138 mitochondrial sequence for that same isolate, a review and update for the published CBS138 mitochondrial genome is likely required as well. Indeed, high ( $\sim 0.5 \%-1 \%$ ) frequencies of structural variation in the nuclear genomes of $C$. glabrata isolates was recently found using de novo assemblies from long single-molecule real-time reads [68].

The rapidity that $C$. glabrata can mutate important genes and gene families, both via microevolution and putative recombination highlights an obstacle for future drug-development, given that individual gene targets are able to mutate within short time spans, and substantial diversity already present between STs. In addition, the epidemiology of $C$. glabrata is poorly understood. Future sampling and genomic comparison studies are necessary to identify the routes and mechanisms of its spread and evolution.

## Data availability

Raw sequences for all haploid isolates of $C$. glabrata from this study have been deposited in the NCBI Sequence Read Archive (SRA) under BioProject PRJNA669061.

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## Competing Interest Statement

The authors declare no competing interests.

## Figures and Tables

Figure 1. Candida glabrata isolates were collected across eight health boards across Scotland in 2012, belonging to 20 separate sequence types, including the newly described ST204. Duplicate isolates stemming from the same patient at different time points have been excluded.

Figure 2. A NeighborNet network using SplitsTree, with sequence types (ST) labels replacing isolate names at the nodes. Green $=$ found in Scotland, purple $=$ not found in Scotland. The scale bar represents nucleotide substitutions per site.

Figure 3. a) A RAxML phylogenetic tree with 1000 bootstrap support of all Saccharomycetaceae species that had a genome assembly in NCBI or JGI

Mycocosm and nucleotide diversity ( $\pi$ ). Note: C. glabrata is calculated from whole genome sequence data presented in this study, while the other species are based on ITS sequences only [54]. b) $\pi$ (based on ITS sequences only) for all Saccharomycotina and non-Saccharomycotina that are listed in the ISHAM ITS reference DNA barcoding database [54]. c) non-overlapping $5 \mathrm{~kb}, 10 \mathrm{~kb}$ and 20 kb windows of $\bar{x} \pi$ ( $\pi$ for all sites in the genome divided by window length).

Figure 4. Population genetics of $C$. glabrata sequence types (ST). a) Principalcomponent analysis (PCA) of whole-genome SNPs using SmartPCA revealed little evidence of sub-clustering among STs (isolates are calculated and plotted ndividually, but labelled by their ST alone for clarity). SmartPCA failed to calculate the eigenvalues for some isolates including those belonging to ST4. b) The crossvalidation (CV) error from running unsupervised ADMIXTURE for variant-sites across the $C$. glabrata population, testing K values between 1 and $35 . \mathrm{K}=20$ provided the lowest CV error. c) ADMIXTURE plot for all isolates using $\mathrm{K}=20$, revealing several isolates with evidence of mixed ancestry. Isolates are ordered according to the neighbor-joining tree constructed with PAUP in Figure S1.

Figure 5. Breadth of coverage and depth of coverage across each of the 37 mitochondrial encoded genes for all 151 isolates compared in this study (Each point represents an isolate). A) Breadth of coverage as a \% across each gene. B) The Normalised depth of coverage for each gene (total read depth for each gene / total read depth across both nuclear and mitochondrial genomes). C) Breadth of coverage as a \% across each gene, categorised by sequence types (ST)s. D) Normalised depth of coverage for each gene, categorised by ST.

Figure 6. Microevolutionary changes across seven sets of C. glabrata isolates. A) a RAxML phylogenetic tree of the serial isolates using the general-time-reversible model and CAT rate approximation with 100 bootstrap support. Branch lengths indicate the mean number of changes per site. B) The number of serial mutations total (All), those within protein-coding sequence (CDS), intergenic and intronic regions. C) Those same serial mutations per kb (calculated as the count of serial mutations divided by the total length of the feature (where All = whole genome) and multiplied by 1000). D) Serial mutations within CDS categorized by their effect on the sequencing: Insertion/Deletion (Indel), synonymous mutation (Syn.), nonsynoynmous mutation (Non.Syn.) and nonsense mutation. E) Those same serial mutations within CDS per kb.

Figure S1. Phylogenetic trees of $C$. glabrata. All genomic sites that were either a homozygous reference or SNP in every isolate of $C$. glabrata and $C$. bracarensis AGP [40] for rooting were identified using ECATools and concatenated into a FASTA file. A) A neighbor-joining tree constructed with PAUP. Scale bar indicates the distance based on substitutions per site. B) A maximum likelihood tree constructed using RAxML PThreads v.7.7.8 [39] using the general-time-reversible model and CAT rate approximation with 100 bootstrap support. Branch lengths indicate the mean number of changes per site. The clade according to Carreté L et al. 2018 [24], as well as sequence type $(\mathrm{ST})$, country code $(\mathrm{AU}=$ Australia, $\mathrm{BE}=$ Belgium, $\mathrm{DE}=$ Germany, FR = France, GB = Great Britain, IT = Italy, TW = Taiwan, US = United States), MAT and reference are also shown.

Figure S2. Mean $\mathrm{F}_{\text {ST }}$ values from pairwise comparisons of each sequence type (ST) calculated from a) 10 kb non-overlapping windows and b) 5 kb windows. C) Mean $F_{\text {ST }}$ values from 10 kb windows were similar to values calculated from 5 kb windows, with a mean difference of -0.046 per pairwise comparison.

Figure S3. Non-overlapping 10 kb windows showing $F_{S T}$ values for 12 pairwise comparisons that had long genomic regions with lower values.

Figure S4. Five independent runs of ADMIXTURE using $\mathrm{K}=20$ and time-based seed values, revealing several isolates with evidence of mixed ancestry. Isolates are ordered according to the neighbor-joining tree constructed with PAUP in Figure S1.

Figure S5. Non-overlapping 10 kb windows showing normalized depth of coverage (including GC normalization by percentiles; GC, and excluding ambiguous sites (effective window length)).

Figure S6. Integrated Genome Viewer (IGV) screenshots for the reference isolate CBS138, and all isolates compared in this study, indicating substantial differences between our Illumina sequences and the mitochondrial assembly. Gene features are shown as a track (directionality indicated by arrows), and the read alignment from the BAM files are shown for each isolate, where peaks indicate higher depth, and colors on the peaks indicate discrepancies to the reference base: green $=\mathrm{A}$, blue $=$ C, red $=\mathrm{T}$, brown $=\mathrm{G}$, purple $=$ insertion $)$

Table 1. GO-term and PFAM enrichment (two-tailed Fisher exact test with false discovery rate (FDR)-corrected $P$ values $(q)$ of $<0.05)$ for genes with $d N / d S(\omega)>1$, and genes with either microevolutionary frameshifts or non-synonymous mutations across the seven sets of serial isolates. The relative proportion (Rel. prop) was calculated as (number of terms in set 1 / number of terms in set 2) * (genes with any terms in set 2 / genes with any terms in set 1 ).

Table 2. Summary of microevolution across seven sets of between 2 and $9 C$. glabrata isolates from recurrent cases of candidiasis. We documented 1,995 mutations between all serial isolates, which were either in protein-coding regions (Coding) or Intergenic and intron regions (Non-coding). Coding mutations were further characterised into Coding Indels, some of which caused frameshifts (Coding Indel (frameshift)), non-synonymous mutations (Coding Non.Syn.), nonsense mutations, (Coding Nonsense), synonymous mutations (Coding Syn.), and bases that reverted back to the ST15 CBS138 reference base (either from a previous microevolutionary change or a pre-existing variant between the initial isolate and the reference ST15 CBS138).

Table 3. Minimum inhibitory concentration (MIC) values of fluconazole for each of the serial isolates.

Table S1. Metadata for clinical Scottish C. glabrata sequenced and analysed in this study.

Table S2. Haploid variant call summary based on alignments to the published nuclear and mitochondrial assembly of ST15 CBS138. These variants form the basis for the population genetic and comparative genomics tests.

Table S3. Diploid variant call summary. Diploid variant calls were used to check for any evidence of heterozygosity suggestive of diploidy. All heterozygous sites (single nucleotide heterozygous positions + heterozygous insertions + heterozygous deletions) amounted to $<0.0404 \%$ ( 0.4 per Kb ) of total positions called per isolate, suggesting these were errors and not evidence of diploidy.

Table S4. Counts of presence/absence (P/A) polymorphisms in each isolate, based on zero reads aligning to the ST15 CBS138 nuclear and mitochondrial genomic regions encoding gene sequences.

Table S5. A summary of $d N / d S(\omega)$ and nonsense mutations found across every gene in isolates representing each of the sequence types (ST).

Table S6. Details of 21 genes (found 67 times across all STs) with $d N / d S(\omega)>1$, which belonged to our set of 129 "genes of interest" including adhesions (e.g. EPA genes), aspartic proteases, phospholipases, cell wall biogenesis, structural wall proteins, regulatory, efflux pumps (all genes in Table 1 of [53]), as well as both FKS and 12 ERG pathway genes.

Table S7. Counts of all microevolutionary changes documented between seven sets of between 2 and $9 C$. glabrata isolates from recurrent cases of candidiasis.

Table S8. Details of 29 genes that had microevolutionary changes documented between seven sets of between 2 and $9 C$. glabrata isolates from recurrent cases of candidiasis, and belonged to our set of 129 "genes of interest" including adhesions (e.g. EPA genes), aspartic proteases, phospholipases, cell wall biogenesis, structural wall proteins, regulatory, efflux pumps (all genes in Table 1 of [53]), as well as both FKS and 12 ERG pathway genes. For each mutation, the information is encoded in a string with details separated by a semi colon. The first detail in variant type (e.g. ref_to_snp, where ref=reference), the second is location in CDS by nucleotide count, the third is the codon position (1, 2 or 3 ), the fourth is codon found along with amino acid position and type. Finally, a short description is given e.g. INSERTION and DELETION along with the number of nucleotides, or SYN=Synonymous, NSY=Non-synonymous, and NON=Nonsense.

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Table 1

## Category

dN/dS>1

| GO/PFAM term | Genes $\omega<1$ | Genes $\omega>1$ | fisher p | $q$ value | Rel. prop | GO/PFAM description |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| GO:0003723 | 428 | 25 | $2.26 \mathrm{E}-04$ | 3.04E-02 | 1.95 | RNA binding |
| GO:0003735 | 152 | 3 | $7.38 \mathrm{E}-05$ | $1.49 \mathrm{E}-02$ | 5.78 | structural constituent of ribosome |
| GO:0003824 | 1745 | 155 | $8.61 \mathrm{E}-05$ | $1.64 \mathrm{E}-02$ | 1.28 | catalytic activity |
| GO:0005515 | 1100 | 81 | $4.48 \mathrm{E}-06$ | $1.41 \mathrm{E}-03$ | 1.55 | protein binding |
| GO:0005740 | 278 | 11 | $5.08 \mathrm{E}-05$ | $1.06 \mathrm{E}-02$ | 2.88 | mitochondrial envelope |
| GO:0005759 | 160 | 4 | $1.90 \mathrm{E}-04$ | $2.65 \mathrm{E}-02$ | 4.56 | mitochondrial matrix |
| GO:0006412 | 287 | 11 | $2.68 \mathrm{E}-05$ | $6.05 \mathrm{E}-03$ | 2.98 | translation |
| GO:0019693 | 100 | 1 | $3.63 \mathrm{E}-04$ | $4.35 \mathrm{E}-02$ | 11.4 | ribose phosphate metabolic process |
| GO:0022626 | 87 | 0 | $1.16 \mathrm{E}-04$ | $1.99 \mathrm{E}-02$ | N/A | cytosolic ribosome |
| GO:0022857 | 277 | 13 | 4.08E-04 | $4.70 \mathrm{E}-02$ | 2.43 | transmembrane transporter activity |
| GO:0036094 | 724 | 52 | $2.58 \mathrm{E}-04$ | 3.31E-02 | 1.59 | small molecule binding |
| GO:0043168 | 689 | 48 | $1.89 \mathrm{E}-04$ | $2.65 \mathrm{E}-02$ | 1.64 | anion binding |
| GO:0044281 | 498 | 27 | $1.57 \mathrm{E}-05$ | $3.86 \mathrm{E}-03$ | 2.1 | small molecule metabolic process |
| GO:0044391 | 143 | 3 | $2.32 \mathrm{E}-04$ | 3.05E-02 | 5.44 | ribosomal subunit |
| GO:0071840 | 1325 | 113 | $2.76 \mathrm{E}-04$ | 3.47E-02 | 1.34 | cellular component organization or biogenesis |
| GO:1901362 | 364 | 19 | $1.92 \mathrm{E}-04$ | $2.65 \mathrm{E}-02$ | 2.18 | organic cyclic compound biosynthetic process |
| PF00624.20 | 4 | 23 | 6.53E-20 | 7.42E-17 | 0.02 | Flocculin repeat |
| PF10528.11 | 12 | 10 | $1.87 \mathrm{E}-05$ | 1.07E-02 | 0.13 | GLEYA domain |
| PF00514.25 | 8 | 8 | $5.72 \mathrm{E}-05$ | 2.17E-02 | 0.11 | Armadillo repeat |


| Microevolution (Frameshift) | GO/PFAM term | Genes without frameshift | Genes with frameshift | fisher $p$ | q value | Rel. <br> prop | GO/PFAM description |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | GO:0009986 | 30 | 9 | $7.53 \mathrm{E}-12$ | 4.26E-08 | 0.03 | cell surface |
|  | GO:0009987 | 3616 | 17 | $1.20 \mathrm{E}-05$ | $3.38 \mathrm{E}-02$ | 1.7 | cellular process |
|  | PF05001.15 | 0 | 17 | 1.10E-39 | 1.25E-36 | 0 | RNA polymerase Rpb1 C-terminal repeat |
|  | PF10528.11 | 13 | 9 | $5.54 \mathrm{E}-15$ | $3.15 \mathrm{E}-12$ | 0.01 | GLEYA domain |
|  | PF00399.21 | 24 | 9 | $4.09 \mathrm{E}-13$ | $1.55 \mathrm{E}-10$ | 0.02 | Yeast PIR protein repeat |
|  | PF08238.14 | 14 | 6 | $2.64 \mathrm{E}-09$ | $7.49 \mathrm{E}-07$ | 0.02 | Sel1 repeat |
|  | PF11765.10 | 6 | 3 | $2.58 \mathrm{E}-05$ | 5.86E-03 | 0.01 | Hyphally regulated cell wall protein N-terminal |
|  | PF09770.11 | 0 | 2 | 4.79E-05 | $9.08 \mathrm{E}-03$ | 0 | Topoisomerase II-associated protein PAT1 |
| Microevolution |  | Genes without | Genes with |  |  |  |  |
| (Nonsynonymous) | GO/PFAM | non- | non- |  |  | Rel. prop |  |
| synonymous) | GO-0009986 | 28 | 11 | $7.88 \mathrm{E}-10$ | 4.45E-06 | $0.06$ |  |
|  | PF10528.11 | 12 | 10 | $3.14 \mathrm{E}-11$ | $3.58 \mathrm{E}-08$ | 0.03 | GLEYA domain |
|  | PF11765.10 | 4 | 5 | $1.03 \mathrm{E}-06$ | 5.87E-04 | 0.02 | Hyphally regulated cell wall protein N-terminal |

without
frameshift frameshift

64E-09
5.86E-03
0.02 Sel1 repeat

Hyphally regulated cell wall protein N-terminal
Topoisomerase II-associated protein PAT1

Genes
without Genes with nonsynonymous

| Case ID | Initial | Relapse | ST | All <br> Mutations | Coding | Noncoding | Coding Indel | Coding Indel (frameshift) | Coding (Non.Syn.) | Coding <br> Nonsense | Coding (Syn.) | Coding (revert to ref.) |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 1 | CG107A | CG107B | 36 | 97 | 83 | 14 | 18 | 9 | 16 | 0 | 17 | 32 |
| 2 | CG18A | CG18B | 10 | 140 | 127 | 13 | 20 | 7 | 24 | 0 | 20 | 63 |
| 3 | CG191A | CG191B | 10 | 64 | 53 | 11 | 13 | 4 | 11 | 0 | 8 | 21 |
| 3 | CG191B | CG191C | 10 | 78 | 66 | 12 | 14 | 9 | 10 | 0 | 8 | 34 |
| 3 | CG191C | CG191D | 10 | 83 | 72 | 11 | 17 | 12 | 14 | 0 | 10 | 31 |
| 3 | CG191D | CG191E | 10 | 96 | 85 | 11 | 14 | 4 | 12 | 0 | 9 | 50 |
| 3 | CG191E | CG191F | 10 | 87 | 77 | 10 | 23 | 16 | 19 | 0 | 17 | 18 |
| 4 | CG48A | CG48F | 7 | 92 | 79 | 13 | 10 | 3 | 11 | 0 | 13 | 45 |
| 5 | CG84F | CG84G | 67 | 76 | 64 | 12 | 17 | 5 | 8 | 0 | 5 | 34 |
| 5 | CG84G | CG84H | 67 | 71 | 59 | 12 | 21 | 5 | 9 | 0 | 3 | 26 |
| 6 | CG93A | CG93B | 162 | 125 | 114 | 11 | 20 | 4 | 15 | 0 | 16 | 63 |
| 6 | CG93B | CG93C | 162 | 119 | 105 | 14 | 23 | 10 | 23 | 0 | 18 | 41 |
| 6 | CG93C | CG93D | 162 | 124 | 110 | 14 | 19 | 7 | 16 | 0 | 9 | 66 |
| 6 | CG93D | CG93E | 162 | 112 | 97 | 15 | 24 | 10 | 20 | 1 | 12 | 40 |
| 6 | CG93E | CG93H | 162 | 119 | 105 | 14 | 21 | 5 | 20 | 0 | 18 | 46 |
| 6 | CG93H | CG931 | 162 | 116 | 102 | 14 | 20 | 6 | 13 | 0 | 14 | 55 |
| 6 | CG93I | CG93J | 162 | 96 | 82 | 14 | 22 | 13 | 13 | 0 | 11 | 36 |
| 6 | CG93J | CG93K | 162 | 135 | 120 | 15 | 21 | 11 | 22 | 1 | 28 | 48 |
| 7 | CG97A | CG97B | 25 | 79 | 66 | 13 | 14 | 3 | 15 | 0 | 10 | 27 |
| 7 | CG97B | CG97C | 25 | 86 | 75 | 11 | 11 | 4 | 12 | 0 | 18 | 34 |

Forth Valley ( $\mathrm{n}=5$ )


a)
nucleotide diversity ( $\pi$ )
Number of isolates

b)



## Position in genome (Mb)

5 kb windows

10 kb windows

20 kb windows


B) Norm. depth of coverage

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 | tRNA-Val - : |  |  |
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| tRNA-Tyr - |  |  |
| tRNA-Trp - |  |  |
|  |  |  |
| tRNA-Thr2 - |  |  |
| tRNA-Thr1 - • |  |  |


tRNA-Met2 - • •8
tRNA-Met1-1 $\quad \bullet \bullet 88 \infty$
tRNA-Lys -
tRNA-Leu -
tRNA-lle - -

cyb- •

cox2 - • • \&
cox1- $\quad \therefore$ •装




 atp6 -
84

Breadth (\%)
C)

Breadth of coverage (\%)


Serial Mutations
B)

D)

C)

Serial Mutations / Kb



## Category <br> dN/dS>1

| GO/PFAM term | Genes omega < $\mathbf{1}$ | Genes omega $>\mathbf{1}$ | fisher p | q value |
| :--- | ---: | ---: | ---: | ---: |
| GO:0003723 | 428 | 25 | $2.26 \mathrm{E}-04$ | $3.04 \mathrm{E}-02$ |
| GO:0003735 | 152 | 3 | $7.38 \mathrm{E}-05$ | $1.49 \mathrm{E}-02$ |
| GO:0003824 | 1745 | 155 | $8.61 \mathrm{E}-05$ | $1.64 \mathrm{E}-02$ |
| GO:0005515 | 1100 | 81 | $4.48 \mathrm{E}-06$ | $1.41 \mathrm{E}-03$ |
| GO:0005740 | 278 | 11 | $5.08 \mathrm{E}-05$ | $1.06 \mathrm{E}-02$ |
| GO:0005759 | 160 | 4 | $1.90 \mathrm{E}-04$ | $2.65 \mathrm{E}-02$ |
| GO:0006412 | 287 | 11 | $2.68 \mathrm{E}-05$ | $6.05 \mathrm{E}-03$ |
| GO:0019693 | 100 | 1 | $3.63 \mathrm{E}-04$ | $4.35 \mathrm{E}-02$ |
| GO:0022626 | 87 | 0 | $1.16 \mathrm{E}-04$ | $1.99 \mathrm{E}-02$ |
| GO:0022857 | 277 | 13 | $4.08 \mathrm{E}-04$ | $4.70 \mathrm{E}-02$ |
| GO:0036094 | 724 | 52 | $2.58 \mathrm{E}-04$ | $3.31 \mathrm{E}-02$ |
| GO:0043168 | 689 | 48 | $1.89 \mathrm{E}-04$ | $2.65 \mathrm{E}-02$ |
| GO:0044281 | 498 | 27 | $1.57 \mathrm{E}-05$ | $3.86 \mathrm{E}-03$ |
| GO:0044391 | 143 | 3 | $2.32 \mathrm{E}-04$ | $3.05 \mathrm{E}-02$ |
| GO:0071840 | 1325 | 113 | $2.76 \mathrm{E}-04$ | $3.47 \mathrm{E}-02$ |
| GO:1901362 | 364 | 19 | $1.92 \mathrm{E}-04$ | $2.65 \mathrm{E}-02$ |
|  |  |  |  |  |
| PF00624.20 | 4 | 23 | $6.53 \mathrm{E}-20$ | $7.42 \mathrm{E}-17$ |
| PF10528.11 | 12 | 10 | $1.87 \mathrm{E}-05$ | $1.07 \mathrm{E}-02$ |
| PF00514.25 | 8 | 8 | $5.72 \mathrm{E}-05$ | $2.17 \mathrm{E}-02$ |


| Microevolution (Frameshift) | GO/PFAM term | Genes without frameshift | Genes with frameshift |  | fisher p | $q$ value |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | GO:0009986 | 30 |  | 9 | 7.53E-12 | $4.26 \mathrm{E}-08$ |
|  | GO:0009987 | 3616 |  | 17 | $1.20 \mathrm{E}-05$ | $3.38 \mathrm{E}-02$ |
|  | PF05001.15 | 0 |  | 17 | 1.10E-39 | 1.25E-36 |
|  | PF10528.11 | 13 |  | 9 | 5.54E-15 | $3.15 \mathrm{E}-12$ |
|  | PF00399.21 | 24 |  | 9 | $4.09 \mathrm{E}-13$ | 1.55E-10 |
|  | PF08238.14 | 14 |  | 6 | $2.64 \mathrm{E}-09$ | 7.49E-07 |
|  | PF11765.10 | 6 |  | 3 | 2.58E-05 | 5.86E-03 |
|  | PF09770.11 | 0 |  | 2 | $4.79 \mathrm{E}-05$ | $9.08 \mathrm{E}-03$ |

Microevolution
(Non-synonymous) GO/PFAM term non-synonymous non-synonymous fisher $p$ qualue

| GO:0009986 | 28 | 11 | $7.88 \mathrm{E}-10$ | $4.45 \mathrm{E}-06$ |
| :--- | ---: | ---: | ---: | ---: |
|  |  |  |  |  |
| PF10528.11 | 12 | 10 | $3.14 \mathrm{E}-11$ | $3.58 \mathrm{E}-08$ |
| PF11765.10 | 4 | 5 | $1.03 \mathrm{E}-06$ | $5.87 \mathrm{E}-04$ |

## Rel. prop GO/PFAM description

1.95 RNA binding
5.78 structural constituent of ribosome
1.28 catalytic activity
1.55 protein binding
2.88 mitochondrial envelope
4.56 mitochondrial matrix
2.98 translation
11.4 ribose phosphate metabolic process

N/A cytosolic ribosome
2.43 transmembrane transporter activity
1.59 small molecule binding
1.64 anion binding
2.1 small molecule metabolic process
5.44 ribosomal subunit
1.34 cellular component organization or biogenesis
2.18 organic cyclic compound biosynthetic process
0.02 Flocculin repeat
0.13 GLEYA domain
0.11 Armadillo repeat

## Rel. prop GO/PFAM description

0.03 cell surface
1.7 cellular process

0 RNA polymerase Rpb1 C-terminal repeat
0.01 GLEYA domain
0.02 Yeast PIR protein repeat
0.02 Sel1 repeat
0.01 Hyphally regulated cell wall protein N-terminal

0 Topoisomerase II-associated protein PAT1

## Rel. prop GO/PFAM description

0.06 cell surface
0.03 GLEYA domain
0.02 Hyphally regulated cell wall protein N-terminal

| Case ID | Initial | Relapse | ST | All <br> Mutations | Coding | Non-coding | Coding Indel | Coding Indel (frameshift) | Coding (Non.Syn.) |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | 1 CG107A | CG107B | 36 | 97 | 83 | 14 | 18 | 9 | 16 |
|  | 2 CG18A | CG18B | 10 | 140 | 127 | 13 | 20 | 7 | 24 |
|  | 3 CG191A | CG191B | 10 | 64 | 53 | 11 | 13 | 4 | 11 |
|  | 3 CG191B | CG191C | 10 | 78 | 66 | 12 | 14 | 9 | 10 |
|  | 3 CG191C | CG191D | 10 | 83 | 72 | 11 | 17 | 12 | 14 |
|  | 3 CG191D | CG191E | 10 | 96 | 85 | 11 | 14 | 4 | 12 |
|  | 3 CG191E | CG191F | 10 | 87 | 77 | 10 | 23 | 16 | 19 |
|  | 4 CG48A | CG48F | 7 | 92 | 79 | 13 | 10 | 3 | 11 |
|  | 5 CG84F | CG84G | 67 | 76 | 64 | 12 | 17 | 5 | 8 |
|  | 5 CG84G | CG84H | 67 | 71 | 59 | 12 | 21 | 5 | 9 |
|  | 6 CG93A | CG93B | 162 | 125 | 114 | 11 | 20 | 4 | 15 |
|  | 6 CG93B | CG93C | 162 | 119 | 105 | 14 | 23 | 10 | 23 |
|  | 6 CG93C | CG93D | 162 | 124 | 110 | 14 | 19 | 7 | 16 |
|  | 6 CG93D | CG93E | 162 | 112 | 97 | 15 | 24 | 10 | 20 |
|  | 6 CG93E | CG93H | 162 | 119 | 105 | 14 | 21 | 5 | 20 |
|  | $6 \mathrm{CG93H}$ | CG93I | 162 | 116 | 102 | 14 | 20 | 6 | 13 |
|  | 6 CG93I | CG93J | 162 | 96 | 82 | 14 | 22 | 13 | 13 |
|  | 6 CG93J | CG93K | 162 | 135 | 120 | 15 | 21 | 11 | 22 |
|  | 7 CG97A | CG97B | 25 | 79 | 66 | 13 | 14 | 3 | 15 |
|  | 7 CG97B | CG97C | 25 | 86 | 75 | 11 | 11 | 4 | 12 |


| Coding <br> Nonsense | Coding <br> (Syn.) | Coding <br> (revert to ref.) |
| :---: | :---: | ---: |
| 0 | 17 | 32 |
| 0 | 20 | 63 |
| 0 | 8 | 21 |
| 0 | 8 | 34 |
| 0 | 10 | 31 |
| 0 | 9 | 50 |
| 0 | 17 | 18 |
| 0 | 13 | 45 |
| 0 | 5 | 34 |
| 0 | 3 | 26 |
| 0 | 16 | 63 |
| 0 | 18 | 41 |
| 0 | 9 | 66 |
| 1 | 12 | 40 |
| 0 | 18 | 46 |
| 0 | 14 | 55 |
| 0 | 11 | 36 |
| 1 | 28 | 48 |
| 0 | 10 | 27 |
| 0 | 18 | 34 |

Case ID Strain MIC (ug/mL) Change
1 107a 8
1 107b $16 \quad 8$
2 18a 8
2 18b 8
3 191a 8
3 191b 8
3 191c 8
3 191d 8
3 191e 8
3 191f 8
4 48a 4
448 f
$584 \mathrm{f} \quad 8$
$584 \mathrm{~g} \quad 8$
5 84h 4 -4
6 93a 4
6 93b 4
6 93c 4
6 93d 4
6 93e 4
6 93h >64 >60
6 93i >64
6 93j >64
6 93k 4 -60
7 97a 4
7 97b 4
7 97c 8

