

Complex history of the amphibian-killing chytrid fungus revealed with genome resequencing data

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Edited by David M. Hillis, University of Texas at Austin, Austin, TX, and approved March 15, 2013 (received for review January 4, 2013)

Understanding the evolutionary history of microbial pathogens is critical for mitigating the impacts of emerging infectious diseases on economically and ecologically important host species. We used a genome resequencing approach to resolve the evolutionary history of an important microbial pathogen, the chytrid *Batrachochytrium dendrobatidis* (Bd), which has been implicated in amphibian declines worldwide. We sequenced the genomes of 29 isolates of Bd from around the world, with an emphasis on North, Central, and South America because of the devastating effect that Bd has had on amphibian populations in the New World. We found a substantial amount of evolutionary complexity in Bd with deep phylogenetic diversity that predates observed global amphibian declines. By investigating the entire genome, we found that even the most recently evolved Bd clade (termed the global panzootic lineage) contained more genetic variation than previously reported. We also found dramatic differences among isolates and among genomic regions in chromosomal copy number and patterns of heterozygosity, suggesting complex and heterogeneous genome dynamics. Finally, we report evidence for selection acting on the Bd genome, supporting the hypothesis that protease genes are important in evolutionary transitions in this group. Bd is considered an emerging pathogen because of its recent effects on amphibians, but our data indicate that it has a complex evolutionary history that predates recent disease outbreaks. Therefore, it is important to consider the contemporary effects of Bd in a broader evolutionary context and identify specific mechanisms that may have led to shifts in virulence in this system.

Emerging infectious diseases (EIDs) pose significant challenges for human health, agricultural crops, and economically and ecologically important populations in nature (1–4). The incidence of EIDs has been steadily rising over the last several decades (5, 6), and EIDs are of particular concern in an increasingly globalized world. For example, the majority of human EIDs is zoonoses that originate in wildlife (5) and subsequently, create a significant burden for global economies and public health (7, 8). Therefore, scientific efforts to understand and respond to EIDs are critical in diverse fields from biomedicine to conservation biology.

Although EIDs result from a complex interplay of factors, many studies focus primarily on the emergence of novel microbial pathogens. There are, in fact, high-profile examples of EIDs caused by the rapid appearance of novel, hypervirulent, or host-switching strains (9–11), but EIDs are not always caused by rapid or recent evolution of the pathogen itself. Virulence itself is an emergent property of microbe–host–environment interactions (12). Thus, EIDs can result from shifts in any factor—or combination of factors—in the microbe–host–environment epidemiological triangle (13). Characterizing the evolutionary history of emerging pathogens

is, thus, critical, allowing us to determine whether observed EIDs result from rapid, recent shifts in organisms with pathogenic potential.

Chytridiomycosis is an EID responsible for declines in amphibian species around the world. The chytrid fungus *Batrachochytrium dendrobatidis* (Bd) was discovered and linked to amphibian declines in 1998 (14, 15). Chytridiomycosis is caused by Bd and kills amphibians by disrupting the integrity of their skin, a physiologically important organ that is involved in gas exchange, electrolyte balance, hydration, and protection from other pathogens (16, 17). Bd infects hundreds of species of amphibians, is found on all continents where amphibians occur, and is responsible for declines and extirpations in a diversity of amphibian hosts (18).

Soon after Bd was discovered, researchers proposed two competing hypotheses for the emergence of chytridiomycosis. The emerging pathogen hypothesis posited that a novel disease agent caused chytridiomycosis, and the endemic pathogen hypothesis proposed that an environmental shift disrupted a previously benign microbe–host interaction (19). Over the years, spatiotemporal and genetic data have supported the emerging pathogen hypothesis (reviewed in refs. 20 and 21). Spatiotemporal data provided clear evidence that Bd arrived and spread through geographic regions where it was not present historically (22–24). Early genetic studies also found very little genetic differentiation in Bd with no geographic signal, consistent with a recent, rapid spread of a novel disease agent (25–27). Recently, genetic and genomic data have been used to describe a geographically widespread Bd lineage [termed the global panzootic lineage (GPL)] (28) and several putatively endemic Bd lineages (28–30). However, different studies have used different methods and focused sampling in different parts of the world, precluding integration across studies to determine the evolutionary history leading to the emergence of Bd as a global threat to amphibians.

Here, we present whole-genome sequencing from a global panel of Bd isolates to show that Bd has a historically deeper and more complex evolutionary history than previously appreciated. We sequenced Bd genomes from around the world and also, a non-Bd

Author contributions: E.B.R., T.Y.J., K.R.Z., and J.E.S. designed research; E.B.R., T.J.P., D.R., K.R.-H., S.J., and T.S.J. performed research; J.E.L., G.P.O., L.F.T., M.L.A., E.M.M., S.R., S.V.F., L.B., and C.J.B. contributed new reagents/analytic tools; E.B.R., T.Y.J., T.J.P., D.I., D.R., J.M.E., and J.E.S. analyzed data; and E.B.R., T.Y.J., K.R.Z., T.J.P., J.M.E., and J.E.S. wrote the paper.

The authors declare no conflict of interest.

This article is a PNAS Direct Submission.

Freely available online through the PNAS open access option.

Data deposition: The genomic data reported in this paper have been deposited in the NCBI Sequence Read Archive (accession no. [SRA062886](https://doi.org/10.1093/bioinformatics/btt000)).

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This article contains supporting information online at www.pnas.org/lookup/suppl/doi:10.1073/pnas.1300130110/-DCSupplemental.

thus far is contained in this group and there is an apparent association with the onset of epizootics (28).

The tree topologies indicate far greater genetic and evolutionary diversity in Bd than has previously been recognized. In the combined tree, we identify several distinct clades (Fig. 1), including one clade composed of Bd isolates from Brazil, one clade previously identified by Farrer et al. (28) from southern Africa and Spain, and one clade restricted to Switzerland. Our genomic sequencing also revealed additional diversity within the GPL. The analysis of our 29 focal isolates indicated two well-supported clades within the GPL (Fig. S1). Our meta-analysis of 49 isolates did not show high bootstrap support for this primary split within the GPL (possibly because of reduced power from fewer SNPs) but did contain other well-supported clusters within the GPL (Fig. 1). Without additional sampling, it is premature to consider whether the diversity within the Bd tree represents variation within a single species or deeper taxonomic variation. In all probability, with more sampling, additional deeply branching lineages will be uncovered. We conclude that Bd is composed of multiple divergent lineages and that the emergence of the globally distributed GPL occurred within the context of deeper ancestral diversity, much of which may yet be discovered.

Is Bd a Novel or Endemic Pathogen? The novel and endemic pathogen hypotheses generate different predictions for genetic variation within Bd. If Bd was largely endemic, we would expect deep phylogenetic structure in the Bd tree corresponding to geographic locality and/or host association. If Bd was entirely novel, we would expect a shallow and comb-like tree topology. Previous genetic data have largely supported the novel pathogen hypothesis (25–28), but many of these datasets have relied on fewer variable markers or more limited geographic sampling, resulting in tree topologies that appear more shallow and comb-like than those topologies presented here.

Overall, our genomic data suggest that we should consider a less binary classification rather than attempting to reconcile the diversity of Bd isolates as purely novel or purely endemic. On one end of the spectrum, our data were not broadly consistent with the endemic pathogen hypothesis. Generally, isolates that shared a common geographic or host association did not cluster within clades. Some closely related isolates did share a common geography (e.g., the pairing of JEL270 and JEL271 isolated from Bullfrogs in Point Reyes, California; the pairing of CJB5 and CJB7 isolated from Mountain Yellow-Legged Frogs in the Sierra Nevada Mountains, California; and the clade containing VAo2, VAo4, VAo5, and VRp1 from Valencia, Spain). This microgeographic signal does not reflect ancient geographic structure or long-term host associations but instead, is likely explained by the invasion and subsequent evolution of clones in particular geographic regions. On the other end of the spectrum, the presence of lineages that diverged before the GPL indicates that the evolutionary history of Bd is more ancient than suggested by the novel pathogen hypothesis. Even the GPL, which contains closely related and globally dispersed isolates, is not genetically homogenous (Fig. 1). Therefore, our data reveal that Bd is likely endemic in some parts of its range but novel in others.

Bd certainly functions as an invasive species in many parts of the world, and the novel pathogen hypothesis is supported in particular locations by unambiguous spatiotemporal evidence. For example, there are well-documented examples of recent introduction and spread of Bd in many regions, including Panama (24, 34), California (23), and Australia (18, 35). However, these recent introductions should be viewed from a backdrop of Bd diversity. One plausible scenario supported by our data is that recent Bd introductions occurred from an ancestral pool of variation that is deeper than previously considered.

Where Did Bd Originate? Because our genomics dataset included a non-Bd chytrid (Hp), we were able to root our phylogenetic analysis. Thus, we could identify lineages that were more basal in the Bd tree and determine whether these lineages showed an

association with particular hosts or particular regions of the world. The basal lineage in our tree was from Brazil (Fig. 1). One of the Brazilian Bd isolates was collected from *Hylodes ornatus* from São Paulo, Brazil, and one was collected from a bullfrog in a US market that likely traces back to Brazil (30). Brazil seems to contain ancestral variation, and Bd dynamics in natural ecosystems in Brazil may be largely consistent with an endemic scenario [i.e., Bd has been reported in a number of Brazilian frog species, but mass die offs have not been observed (36–38)]. In addition to the more basal Bd-Brazil clade, a number of isolates from Brazil were contained in the GPL. A previous study suggested that novelty could arise by hybridization of Bd-Brazil with GPL isolates and subsequently spread through the international wildlife trade (30). However, both bullfrog and Brazilian isolates were scattered throughout our tree (Fig. 1), and we have no direct evidence for any specific region or host species as an evolutionary source.

Our results underscore that it is premature to conclude a geographic location for the origin of Bd or any of its subclades. Our analyses revealed deeply branching lineages from Brazil and Africa but no close sister relationship between either of these clades and the GPL. Previous studies have promoted various possibilities for the origin of Bd (29, 30, 39, 40). However, sampling for genomic studies thus far has focused primarily on Europe (28) and the Americas (this study). Additional genomic sampling in other regions is critical. However, undiscovered isolates may fall in key positions in the tree (e.g., base of Bd tree, sister to GPL) and clarify the geographic and host associations at important transition points in the evolutionary history of Bd. However, the true origin of Bd may never be resolved, even with exhaustive sampling of contemporary Bd isolates, given historical dynamics of extinction and migration.

When Did Bd Originate? Our dating analysis suggests the possibility that some Bd lineages are more ancient than previously appreciated. We applied a molecular clock to estimate the age of key nodes within our tree. Time calibration of phylogenetic trees must be done with caution, particularly for analyses that cannot rely on fossil evidence and trees with incomplete taxon sampling. We, therefore, do not advocate that our inferred node depths be upheld as absolute dates but only relative estimates to distinguish between competing hypotheses. Below, we discuss our results for two key nodes: the base of the Bd tree and the common ancestor of the GPL. The dates provided are dependent on an assumed rate of evolution under a strict clock (i.e., 0.0081 substitutions per site per million years) (41) and a tree prior derived from the constant population-size coalescent (42). Although we report results for these model assumptions, results were quantitatively similar with alternative assumptions (e.g., exponentially increasing population size prior, relaxed clock).

In the analysis including 76,515 SNPs for all 49 isolates, the root for the entire Bd tree was estimated to be 104,700 y B.P., and an age for the most recent common ancestor of the GPL was 26,400 y B.P. To refine our estimates of the age of the GPL, we also conducted separate analyses for different partitions of the Bd genome for this group. We looked at loss of heterozygosity (LOH) and non-LOH regions separately for each supercontig (Fig. 1). Considering all 49 isolates in a common analysis, the non-LOH data partition revealed significantly earlier divergence dates than the LOH data partition (Welch t test_{df} = 15.635, t = 4.3849, P < 0.001). Specifically, the average divergence depths recovered for the GPL from the non-LOH regions were 41,805 y and the LOH regions were 9,843 y. The youngest depth estimate for the GPL was from an LOH region on supercontig 2 (1,024 y), and the oldest depth estimate was from a non-LOH region on supercontig 8 (90,000 y).

It is not unusual for different data partitions to recover different divergence depths given among-locus variation in core processes that influence genetic variation (e.g., mutation hotspots, regions under selection, incomplete lineage sorting, recombination, and gene conversion) (43). Furthermore, among-locus discordance can be informative for distinguishing between alternative demographic

scenarios. For example, our data suggest that the GPL may be older than previously proposed. The most consistent signal in our data suggests an origin of the GPL in the 10,000- to 40,000-y range. If the GPL is, in fact, tens of thousands of years old, the reduced variation in the LOH region on supercontig 2 (where a large chromosomal region is homozygous and nearly monomorphic throughout the GPL) could be caused by purifying selection, ongoing gene conversion, or a selective sweep propagated through the GPL by strong selection. Alternatively, it is possible that the LOH event on supercontig 2 predated the emergence of the GPL and was inherited asexually during the spread of GPL. This alternative is supported by the fact that the LOH boundary is largely identical among isolates (Fig. S2). If the age of the GPL is estimated solely by the LOH region on supercontig 2, the GPL seems much younger (1,024 y with a confidence range of 500–1,500 y). The young date estimated from this genomic segment is still older than—but within one order of magnitude of—the divergence date presented by Farrer et al. (28). If the GPL is, indeed, this young, we must explain why there is so much sequence variation among isolates in other regions of the genome. If this pervasive variation represents sorting of ancestral variants, it would suggest a highly diverse ancestor to the GPL. It is also important to note that even the youngest divergence dates obtained predate contemporary observed amphibian declines.

What Is the Role of Hybridization and Sexual Reproduction in Bd?

Although sexual reproduction has never been observed in Bd, sexual recombination and hybridization have been proposed as important mechanisms in the evolutionary history of Bd. For example, a recent discovery of a hybrid between the GPL and a divergent Bd lineage from Brazil suggests that genetically distinct isolates can hybridize (isolate CLFT024-02) (30). Moreover, hybridization has been proposed as a potential explanatory mechanism for the origin of the GPL clade as a whole (28). Our genome-scale data are consistent with the hypothesis that some isolates may have a hybrid history. Specifically, we show that isolate CLFT024-02 has elevated heterozygosity with nearly double the percentage of heterozygous SNPs than the other sampled isolates (Fig. 2).

However, our data do not support the hypothesis of a hybrid origin for the GPL as a whole. Recent hybridization between two lineages, such as observed in CLFT024-02, should be observed as increased heterozygosity or ploidy relative to nonhybrid isolates. However, we did not observe elevated heterozygosity in the GPL, with no significant difference between the percentage of heterozygous SNPs comparing GPL with non-GPL isolates (*t* test: $P = 0.56$, excluding the hybrid CLFT024-02 from analyses and focusing only on SNPs outside LOH regions). We also did not observe a shared pattern of increased ploidy in the GPL (Fig. 3). Thus, although hybridization potentially plays a role in generating

and sorting genetic and functional variation in Bd, our genomic data do not provide evidence that a specific historical hybridization event led to the emergence of the GPL.

We also looked for genomic evidence of recurrent sexual reproduction in Bd. Recurrent sexual reproduction will lead to an inbreeding coefficient (F_{IS}) (44) of zero, but the mean F_{IS} observed among all SNPs in the GPL was -0.319 ($SE \pm 0.002$; $SD \pm 0.473$). The high variance in F_{IS} and the large range of heterozygosity values across isolates (Fig. 2) could be caused by either rare sexual reproduction or mitotic recombination (27, 30). Meiotic recombination and mitotic recombination leave different genomic signatures and thus, can be distinguished with resequencing data. With sexual recombination within the GPL (equivalent to selfing), we expect a positive correlation between chromosome size and heterozygosity, because per base pair recombination rate increases with chromosome size (45, 46). With mitotic recombination, we expect a negative correlation between heterozygosity and chromosome size, because randomly placed mitotic cross-overs affect a larger number of base pairs as chromosome sizes increase. We found that F_{IS} was negatively correlated with supercontig size ($r^2 = 0.60$; $P < 0.001$) with all supercontigs except the largest, having an overall negative F_{IS} average (Fig. S3). Therefore, although we cannot exclude the possibility that some Bd clades undergo sexual reproduction, genome-wide patterns are more consistent with pervasive mitotic rather than meiotic recombination.

What Are the Dynamics of Genome Evolution in Bd? Our data identified other dynamic genome processes in Bd, including dramatic chromosomal aneuploidy, copy number variation (CNV), and LOH. We documented extensive aneuploidy (i.e., changes in chromosome copy number without changes in ploidy of the entire chromosomal set) among isolates and among chromosomal segments within isolates (Fig. 3). Chromosomal copy number varied among our samples from monosomic to tetrasomic (Fig. 3). In fact, only a handful of isolates showed consistent patterns of disomy across their entire genomes (e.g., UM142, TST75, MLA1, and SRS812). Some isolates showed elevated copy numbers at most chromosomal segments (e.g., JEL408, JEL427, JEL429, JEL271, and NCRC106979) but not consistently across the genome. Although some of the isolates with higher chromosomal copy number were found in the GPL, chromosomal copy number was a poor indicator of relatedness in general (i.e., ploidy patterns were not clustered in the tree). We found evidence of monosomy in only one isolate (JEL289) at supercontig 16. In addition to patterns across isolates, we also evaluated patterns across chromosomal segments. Several segments, such as supercontigs 3 and 5, tended to have increased copy numbers, but we did not find a strong pattern of shared aneuploidy in particular genomic regions across a majority of isolates. Estimates of mean copy number of supercontigs

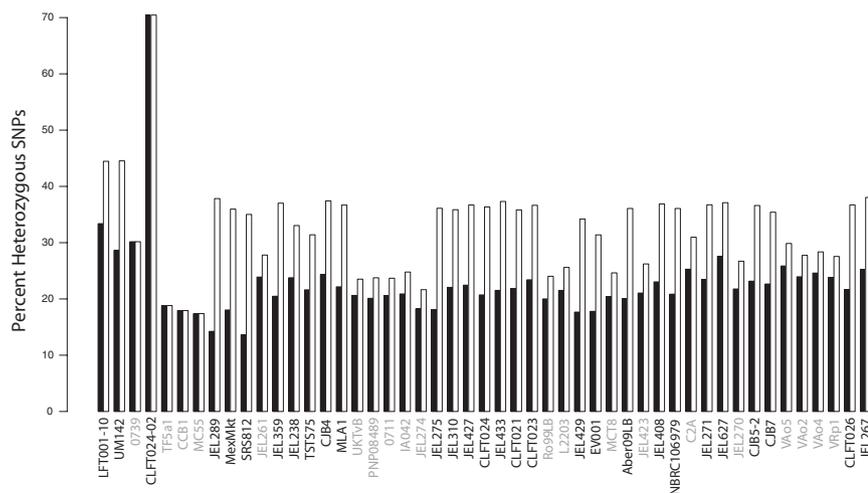


Fig. 2. Percentage of heterozygous SNPs. Black bars represent all data from the largest 16 supercontigs, and white bars represent only non-LOH regions. As expected, the percentage of heterozygous SNPs is elevated when LOH regions are excluded. Also highlighted is elevated heterozygosity in the putative hybrid isolate CLFT024-02. Isolates from the study by Farrer et al. (28) are shown with gray isolate names and generally show lower heterozygosity because of lower sequencing coverage.

devastated by the GPL. Close comparative examination of Bd isolates will determine whether particular genomic regions can be unambiguously linked to the spread of the GPL and whether the dynamic genomic processes described here could play a role in functional shifts in Bd. We also need to renew efforts to understand cofactors that may help explain the recent impacts of Bd on amphibians and maintain an integrative focus on microbe–host–environment interactions. Overall our data emphasize the importance of considering the evolutionary origins of seemingly novel disease agents and help focus our Bd research agenda on the evaluation and implications of a more complex and ancient history for a contemporary ecological crisis.

Methods

Complete methodological details are presented in *SI Methods*. Briefly, we selected 29 Bd isolates for de novo sequencing using Illumina GA Ix and Illumina HiSeq platforms (Table S1). Genomic data are accessioned in the National Center for Biotechnology Information Short Read Archive (accession no. SRA062886). We quality-filtered Illumina reads and generated a stringent SNP dataset by applying a strict minimum coverage filter. We

also integrated our data with published data from an additional geographically complementary 20 Bd isolates (28). We estimated rooted phylogenies using Hp as an outgroup. We used BEAST (v 1.7.3; 40) to sample from the posterior density of time-calibrated trees. We also conducted divergence–time analyses using datasets subsampled at the level of the supercontig and compared estimated heights of the GPL between LOH and non-LOH regions of each supercontig. We also identified regions of the genome exhibiting LOH and chromosome CNV. Finally, we conducted a genomic scan for selection and an analysis of GO enrichment function for genes showing elevated non-synonymous SNP counts.

ACKNOWLEDGMENTS. We acknowledge Peter Murphy, Ché Weldon, Victoria Vasquez, Cinthya Mendoza-Almeralla, and Lisa Schloegel for isolating Bd samples that were included in this study. We thank Ana V. Longo Berríos and David Vallejo for assistance with laboratory work, Scott Cashins for collection of tadpoles for Bd isolation, and Jamie Voyles and two anonymous reviewers for comments on earlier versions of the manuscript. This project was funded by National Science Foundation Grants EF-0723871 and IOS-0825355 (to E.B.R.) and grants from the Cornell Center for Comparative Population Genetics (3CPG) and the Atkinson Center for a Sustainable Future (ACSF; to K.R.Z.).

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Supporting Information

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SI Methods

Isolate Selection and Genomic Sequencing. We selected 29 *Batrachochytrium dendrobatidis* (Bd) isolates for de novo sequencing with multiple samples from the focal regions. We focused on the Americas, with 7 isolates from the western United States, 6 isolates from the eastern United States and Canada, and 13 isolates from Latin America. We also included isolates from Japan, Australia, and South Africa. The chytrid, *Homolophyctis polyrhiza* (Hp; JEL142), which we sequenced previously and does not infect frog skin (1), served as an outgroup to root the evolutionary analyses. Each Bd culture was grown at room temperature for 7–14 d on 1% tryptone and 1% agar plates. Zoospores were flooded from plates and concentrated with a tabletop centrifuge. We extracted genomic DNA using a modified protocol from ref. 2 with 2% (vol/vol) SDS as the extraction buffer or the Qiagen DNeasy Kit. We used the Illumina GA IIx and Illumina HiSeq platforms at the Cornell Core Laboratories. We obtained an average of 24× sequencing depth per isolate (Table S1). All genomic data are accessioned in the National Center for Biotechnology Information Short Read Archive (accession no. SRA062886).

Sequence Alignment and SNP Calling. Illumina reads were quality-filtered (60% bases phred score > 20), low-quality ends were trimmed, and reads were aligned to the genome of JEL423 (ver 17-Jan-2007) with Stampy (3) applying base call recalibration. Best practice protocol for variant calling in GATK was applied (4). Duplicate reads were marked with Picard, and reads containing indels were realigned with Smith–Waterman (GATK walkers RealignerTargetCreator; IndelRealigner). Final variant calls were made and filtered of false positives with GATK UnifiedGenotyper and VariantFiltration walkers. From the resulting SNP dataset, we generated a stringent dataset for downstream analyses by applying a minimum 10× coverage filter on a strain-by-strain basis. Genotype calls with low coverage were converted to missing data calls.

Meta-Analysis. For a subset of comparative analyses, we integrated our data with previously published data from an additional 20 Bd isolates (5). The isolate selection from the two datasets was geographically complementary [our sampling focused on the New World, and the work by Farrer et al. (5) focused on Europe]; 20 isolates from the study by Farrer et al. (5) were sequenced using SOLiD technology. We aligned the SOLiD reads to the Bd genome first using BFAST aligner (6) followed by applying the same variant calling protocol as used with the Illumina data. The read depth was found to be significantly lower in the SOLiD dataset compared with our Illumina data. To reduce false-positive counts, the final SNP calls were made by only considering sites called as variable in the Illumina dataset. De novo SNP calling in SOLiD data significantly increased the number of false-positive SNPs, and subsequent multidimensional scaling (MDS) plots showed separation of strains purely by sequencing technology. However, recalling SNPs with high-depth stringencies based first on our Illumina dataset removed these biases.

Phylogenetic Reconstruction. We estimated rooted phylogenies separately for our 29 isolates and the 49 isolates in the meta-analysis using Hp as the outgroup. Hp alleles were called from whole-genome alignment of Hp and JEL423 genome using the tool Mercator (7) and Prank (8) extracting positions defined as SNPs based on the JEL423 reference position with custom Perl scripts built with BioPerl (9). We generated trees using 101,931

sites in the 29-isolate analysis and 76,515 sites in the 49-isolate analysis, which contained informative SNPs from the nuclear genome. We used the parsimony criterion in PAUP* 4.0 to reconstruct the evolutionary history with these unphased nuclear SNPs (10). We searched tree space by performing 100 search replicates using tree-bisection-reconnection to swap branches. The SNPs were encoded to distinguish six character states. The first three character states (0–2) were used for SNPs, where at least one Bd isolate shared a common allele with Hp (homozygous with respect to Hp allele, and heterozygous and homozygous with respect to an alternate allele). The next three character states (3–5) were used for SNPs, where Bd strains and Hp did not have an allele in common, and they also distinguished the three possible genotypes. We used a hetequal character transition matrix as previously described (11). We performed 200 bootstrap replicates to generate node support values under the parsimony optimality criterion.

Loss of Heterozygosity Analysis. We used a hidden Markov model (HMM) to identify regions in the genome with long stretches of homozygosity. We analyzed the 16 largest supercontigs, which accounted for 98.6% of the total SNP dataset. The HMM was constructed using the RHmm R package (12). We used a non-overlapping sliding window approach, where the number of heterozygous sites was calculated in each 100-bp window and fit to a model for each supercontig by implementing the Baum–Welch algorithm. Then, we used the Viterbi algorithm to predict loss of heterozygosity (LOH) regions with the fitted HMM and the observed SNP data. We cleaned the raw predicted LOH calls by filtering out very short (<1 kbp) regions and obvious false positives, which were likely caused by low read coverage.

Divergence Estimation. We used BEAST (v 1.7.3; 40) to sample from the posterior density of time-calibrated trees for 49 isolates of Bd with Hp as the outgroup. We applied a constant-size coalescent tree prior and a strict molecular clock with a rate of 0.0081 substitutions per site per million years, a rate that has been used in previous studies of fungi (13, 14). Our phylogenomic dataset was unpartitioned and 23,597,406 sites in length, a nearly comprehensive sample of the nuclear genome. We assumed that sites not identified as SNPs were invariant for the nucleotide recorded for our reference strain as above. We allowed the Markov chain Monte Carlo (MCMC) sampling to burn in for the first 10 million generations. After the burn-in period, we sampled every 1,000 generations for an additional 20 million generations. Preliminary analyses invoking a relaxed clock or an exponentially increasing population under the coalescent tree prior were quantitatively similar to our reported results. We also conducted divergence-time analyses using datasets subsampled at the level of the supercontig. To the greatest possible extent, we matched region lengths for LOH and non-LOH segments along the same supercontig. BEAST was used for tree estimation using 30 subsampled datasets. Chain lengths were 10 million generations, the first one-half of which were discarded as burn in. Other details follow the previous description of our BEAST analysis with the concatenated dataset. Using the maximum clade credibility trees for each segment, we compared estimated heights of the global panzootic lineage (GPL) between paired LOH and non-LOH regions of the same supercontig. We assumed that divergence dates were log-normal in distribution, and thus, statistical comparison between data partitions used log-transformed dates.

Chromosome and Copy Number Variation. Ploidy and aneuploidy were estimated using SNP read depth and allele frequencies. The mean depth across SNPs for each supercontig was extracted from the variant call format (VCF) file, and the estimated chromosome copy number was determined by identifying clusters of supercontig depths of similar value using *k*-means clustering with the *pamk* function of the R package *fpc*. Each cluster was assigned to one of the following copy numbers using the distribution of all SNP allele frequencies for that supercontig: monosomy, disomy, trisomy, or tetrasomy. The expectation was that allele frequencies would have a unimodal distribution centered at 0.5 for disomic chromosomes, a bimodal distribution of 0.67 and 0.33 for trisomic chromosomes, and a trimodal distribution of 0.25, 0.5, and 0.75 for tetrasomic chromosomes. Coverage per base was extracted using GATK DepthofCoverage walker. We detected copy number variation as significant expansion or loss of regions of DNA in each strain using a Bayesian approach implemented in the R package *cn.mops* (15). Read counts were extracted from BAM files mapped onto the reference sequence and specifically

normalized for each isolate using the chromosomal numbers estimated during aneuploidy detection. We used a 1,000-bp minimum window size for a copy number variation event, a lower threshold for detection at -1 (corresponding to a twofold reduction in copy number), and an upper detection limit of 1.

Tests for Selection. We scanned for selection by implementing the sequence divergence test *dN/dS* using JEL423 gene models as reference. We used the Yang and Nielsen method, *yn00*, in PAML 4.6 (16) to calculate pairwise *dN/dS* for each gene for comparisons between the GPL isolates ($n = 26$) and the basal UM142 isolate. We then conducted an analysis of Gene Ontology (GO) enrichment function for the genes showing elevated nonsynonymous SNP counts. Enrichment significance was calculated with the GOstats package (17) using GO to gene assignments generated by an InterProScan version 5-RC3 (<https://code.google.com/p/interproscan/>) (18) analysis of the *Bd* proteome. Analysis scripts and datasets are available from https://github.com/stajichlab/bd_popgen.

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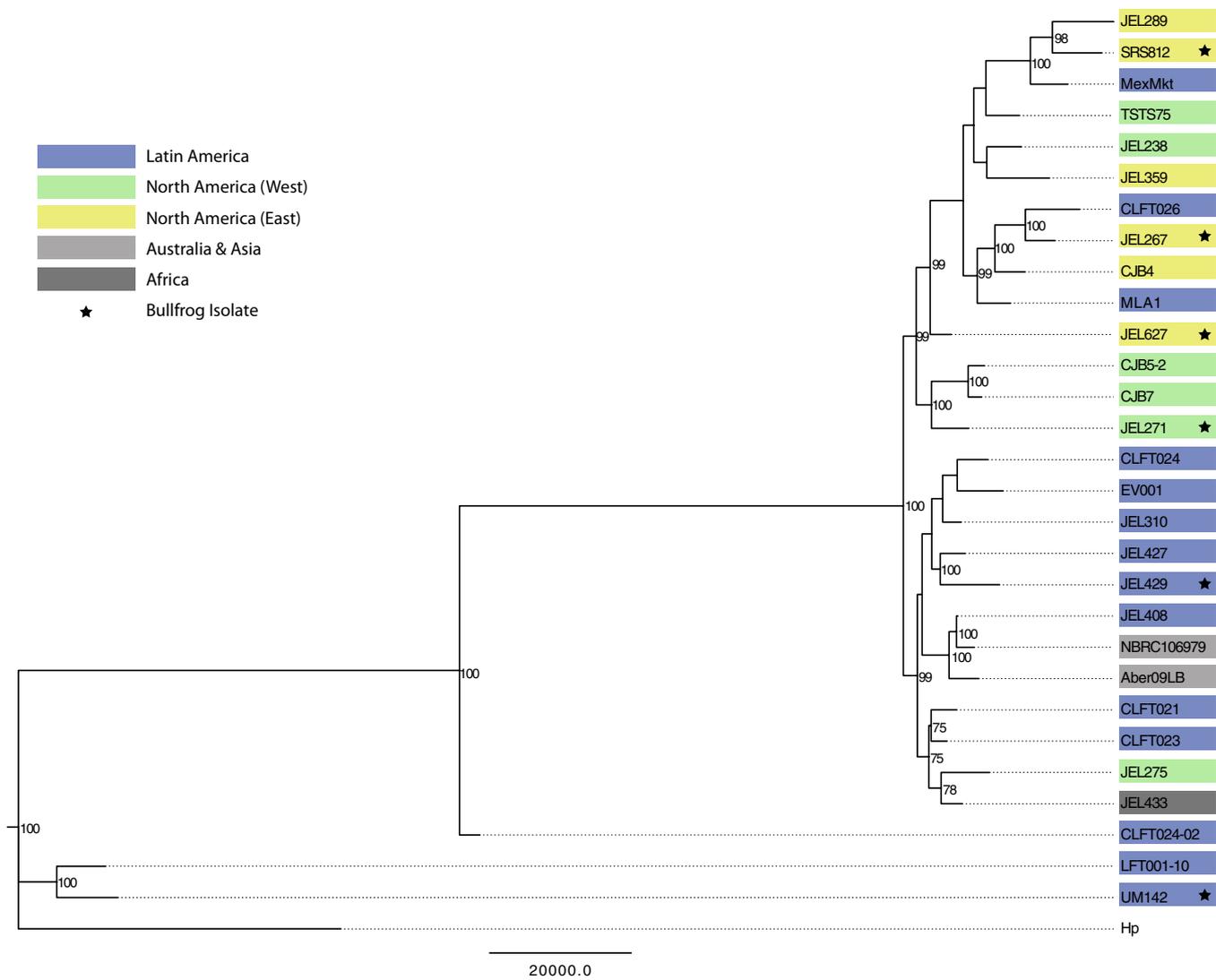


Fig. S1. Rooted Bd phylogeny for 29 isolates that were the focus of this study based on 101,931 SNPs.

