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## Genomics of speciation and introgression in Princess cichlid fishes from Lake Tanganyika

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#### Abstract

How variation in the genome translates into biological diversity and new species originate has endured as the mystery of mysteries in evolutionary biology. African cichlid fishes are prime model systems to address speciation-related questions for their remarkable taxonomic and phenotypic diversity, and the possible role of gene flow in this process. Here, we capitalize on genome sequencing and phylogenomic analyses to address the relative impacts of incomplete lineage sorting, introgression and hybrid speciation in the Neolamprologus savoryi-complex (the 'Princess cichlids') from Lake Tanganyika. We present a time-calibrated species tree based on whole-genome sequences and provide strong evidence for incomplete lineage sorting in the early phases of diversification and multiple introgression events affecting different stages. Importantly, we find that the *Neolamprologus* chromosomes show centre-to-periphery biases in nucleotide diversity, sequence divergence, GC content, incomplete lineage sorting and rates of introgression, which are likely modulated by recombination density and linked selection. The detection of heterogeneous genomic landscapes has strong implications on the genomic mechanisms involved in speciation. Collinear chromosomal regions can be protected from gene flow and harbour incompatibility genes if they reside in lowly recombining regions, and coupling can evolve between nonphysically linked genomic regions (chromosome centres in particular). Simultaneously, higher recombination towards chromosome peripheries makes these more dynamic, evolvable regions where adaptation polymorphisms have a fertile ground. Hence, differences in genome architecture could explain the levels of taxonomic and phenotypic diversity seen in taxa with collinear genomes and might have contributed to the spectacular cichlid diversity observed today.

*Keywords*: genomic landscapes, introgressive hybridization, linked selection, *Neolamprologus*, recombination bias, whole-genome sequencing

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#### Introduction

The origin of new species – the process of speciation – has traditionally been viewed as a strictly bifurcating process, in which one biological species splits into two distinct entities as a consequence of the evolution of complete reproductive isolation between the newly

Correspondence: Hugo F. Gante, Fax: +41 61 267 03 01; E-mail: hugo.gante@unibas.ch emerged forms (*sensu* Mayr 1963; Coyne & Orr 2004). Once a topic of disagreement with botanists, the pervasiveness of introgressive hybridization, defined as the effective flow of genes beyond species boundaries (Anderson 1949; Barton & Bengtsson 1986), is no longer disputed by zoologists. The detection of hybridization and introgression between sister and nonsister species became commonplace with the introduction of molecular markers in evolutionary studies (Dowling & Secor 1997; Arnold 2006). In particular, advances in genotyping methods and DNA sequencing have had a major impact on our understanding of the nature of species boundaries.

Earlier views of reproductive isolation as a property of species and, hence, of whole genomes gradually shifted towards a view where individual genes or specific regions of the genome are responsible for keeping species' distinctiveness (Wu 2001; Baack & Rieseberg 2007; Smadja & Butlin 2011; Feder et al. 2012). Furthermore, empirical studies are making it increasingly clear that interspecific gene flow is an integral part of the speciation process, with manifold potential evolutionary impacts (Abbott et al. 2013). For instance, while hybridization may lead to the fusion of species, it has been suggested that interspecific gene flow may in fact fuel rapid diversification by providing an abundant source of potentially adaptive genetic variation (Seehausen 2004; Berner & Salzburger 2015). In addition, new alleles introduced by introgression may not only be more abundant than alleles originating by mutation, but could also be more beneficial. This is likely because - in contrast to alleles arising de novo by mutation introgressed alleles have already been exposed to natural selection, albeit in the genomic background of the introgression donor (Sætre 2013). Finally, introgression can also lead to the establishment of stable hybrid lineages that are reproductively isolated from parental species, following distinct evolutionary and ecological trajectories (Arnold 2006). Hybrid speciation through polyploidization has been shown to be particularly common in flowering plants and ferns, but a number of cases of homoploid hybrid species have also been documented, both in animals and in plants (DeMarais et al. 1992; Rieseberg et al. 2003; Baack & Rieseberg 2007; Mallet 2007; Mavárez & Linares 2008; Paun et al. 2009; Nolte & Tautz 2010; Salazar et al. 2010; Hermansen et al. 2014; Sousa-Santos et al. 2014; Trier et al. 2014).

Cline theory and hybrid zone studies have been extremely influential to our understanding of the dynamics of introgression. Coupling operating between isolation loci is maintained by linkage disequilibrium and contributes to limit gene flow when related species come into contact, whereas recombination acts in the opposite direction, eroding the association between physically linked loci (e.g. Haldane 1948; Barton 1983; Barton & Bengtsson 1986; Baird 1995; Gavrilets 2004; Bierne et al. 2011; Flaxman et al. 2014). Breaking down linkage with genes under negative selection allows introgression of neutral or positively selected loci that would otherwise be prevented from crossing species boundaries due to Hill-Robertson interference (Hill & Robertson 1966; Barton & Bengtsson 1986; Charlesworth 2009). Because selection acts particularly strongly on early-generation hybrids that carry maladaptive combinations of parental genes, a mechanistic role of hybrid 'filters' shapes the properties of introgressed chromosomal segments [or chromosomal blocks (Hanson 1959; Martinsen *et al.* 2001)]. Therefore, the key factor to *effective* interspecific gene flow is the ratio between selection and recombination in hybrids (Barton & Bengtsson 1986; Baird 1995).

Detection of introgression vs. incomplete lineage sorting and the characterization of hybridization remain major challenges (Abbott et al. 2013). Recent advances in genome-wide typing and whole-genome sequencing have provided unprecedented resolution to identify polymorphisms for adaptation to different niches or characterize the patterns of interspecific gene flow, including the detection of hybrid speciation, adaptive introgression and incomplete lineage sorting in a number of systems (Pollard et al. 2006; Kulathinal et al. 2009; Pardo-Diaz et al. 2012; Heliconius Genome Consortium 2012; Cui et al. 2013; Pease & Hahn 2013; Keller et al. 2013; Nadeau et al. 2013; Martin et al. 2013; Poelstra et al. 2014; Roesti et al. 2014, 2015; Gompert et al. 2014; Huerta-Sánchez et al. 2014; Berg et al. 2015; Eaton et al. 2015; Fontaine et al. 2015; Lamichhaney et al. 2015; Liu et al. 2015; Malinsky et al. 2015; Norris et al. 2015; but see Cruickshank & Hahn 2014). Rapidly diversifying groups are particularly prone to incomplete lineage sorting, and they are also the ones with the largest potential for consequential introgression and hybrid speciation, because of incipient isolation and exploitation of empty ecological niches. Therefore, the application of genomic data to study these groups will be of major importance for understanding the mechanisms of speciation and factors affecting interspecific gene flow.

Here, we employ whole-genome sequencing in combination with phylogenomic analyses to examine the interplay between genome architecture, speciation, and interspecific gene flow (isolation vs. introgression vs. incomplete lineage sorting) in a group of East African cichlid fishes. African cichlids constitute the largest extant vertebrate radiation, with several hundreds of species inhabiting lakes and associated river drainages (Turner et al. 2001; Salzburger 2009; Salzburger et al. 2014). Cichlids have thus become favourite model organisms for studying speciation mechanisms and factors that promote or retard diversification (Kocher 2004; Seehausen 2006; Gante & Salzburger 2012; Santos & Salzburger 2012; Wagner et al. 2012). In addition, five species of African cichlids from different lineages and geographical origins have had their genomes recently sequenced (Brawand et al. 2014). One of these lineages, the tribe Lamprologini, comprises almost half of the entire cichlid diversity in Lake Tanganyika (Gante & Salzburger 2012; Wagner et al. 2012). Lamprologines show complex ecological, morphological, trophic and behavioural attributes, representing a radiation within the cichlid radiation (Stiassny 1997). Unlike other highly diverse cichlid lineages that display extreme levels of sexual dichromatism thought to promote their diversification, such as the radiations of haplochromine cichlids in lakes Malawi and Victoria (Wagner et al. 2012), most lamprologines are sexually monochromatic substrate spawners in which sexes share territorial defence and broodcare (Gante & Salzburger 2012). Furthermore, several examples of introgression have been reported in lamprologine cichlids (e.g. Schelly et al. 2006; Day et al. 2007; Koblmüller et al. 2007; Nevado et al. 2009; Sturmbauer et al. 2010), including a species of putative hybrid origin (Salzburger et al. 2002). Therefore, these taxa provide an extraordinary perspective on the reciprocal impacts of introgression and genome architecture on the evolution of an exceptionally diverse group of cichlids.

#### Materials and methods

#### Study system and specimen origin

Species of the Neolamprologus savoryi-complex, the 'Princess cichlids', are small (up to around 10 cm in standard length) fish endemic to Lake Tanganyika, eastern Africa. All species are cooperative breeders, in which the dominant, breeding couple is aided by up to 25 subordinate helpers in their tasks (territory maintenance, defence, broodcare), and the social group is organized in a strict linear hierarchy (Taborsky & Limberger 1981; Balshine et al. 2001). As a consequence, two species in this group, N. brichardi and N. pulcher, have emerged as important model systems for studying the evolution of cooperative breeding, so that substantial information on life history and behavioural traits has been documented (Wong & Balshine 2011). Social groups of Princess cichlids can be found in coastal rocky substrates of Lake Tanganyika between 3 and 50 m deep. The rocky substrate of Lake Tanganyika provides a territory with shelters and breeding grounds for adhesive eggs (Taborsky 1984; Heg et al. 2004). Each species is distributed around Lake Tanganyika and inhabits its rocky shores in a deme-like fashion, where allopatric populations of one species are often interspersed by populations of other species and by unfavourable (sandy) habitats (Konings 1998). In rare circumstances, up to five Neolamprologus species occur in sympatry (Büscher 1997).

Here, we investigated *Neolamprologus* species previously hypothesized to be involved in hybrid speciation (Salzburger *et al.* 2002) and for which nonmonophyletic mtDNA phylogenies have been found (Duftner *et al.* 2007). Namely, we made use of the published genome sequences of *N. brichardi* originating from the northeastern shore of Lake Tanganyika, in the Burundian– Kigoma area (Brawand *et al.* 2014), and sequenced whole genomes of inbred *N. gracilis* and *N. olivaceous* (hypothetical parental species), *N. marunguensis* (hypothetical hybrid species) all originating from the southwestern shore, in the Democratic Republic of Congo, and *N. pulcher* (polyphyletic with *N. brichardi*) originating from the southern shore, in Zambia (Table S1, Supporting information). Because samples originate from areas of allopatry, in several cases separated by hundreds of kilometres of shoreline, they represent the evolutionary outcome of ancient gene flow (hybridization and introgression) events, rather than present-day hybrid zone dynamics.

#### Sample processing and whole-genome sequencing

High-quality genomic DNA was isolated from fresh fin tissue of one female individual per species using Qiagen DNeasy® Blood and Tissue Kit, diluted to 11-14  $ng/\mu L$  (100  $\mu L$ ) with Qiagen Elution Buffer (Qiagen) and fragmented to ~300 bp by sonication on a Bioruptor® Next Gen. All libraries were constructed following Illumina TruSeq Sample Prep v2 Low-Throughput Protocol, including agarose gel size selection, and sequenced on Illumina HiSeq 2500. This yielded 157.1-180.6 million PE reads of length 101 bases each, and an average insert size of 269-311 bases. To assess the sequence quality and gene space completeness of the newly sequenced Neolamprologus genomes, we first assembled each genome de novo using the CELERA ASSEM-BLER package (Miller et al. 2008). We then used the software CEGMA version 2.4.010312 (Parra et al. 2007, 2009) to investigate the presence ('partial' or 'complete') of 248 conserved eukaryotic genes with few paralogs. Assembly coverage  $(18.5-21.4\times)$  and the numbers of 'partial' and 'complete' genes recovered for each species are given in Table S2 (Supporting information).

### Whole-genome alignments

Taking advantage of high collinearity among cichlid genomes (Brawand *et al.* 2014), we used the Illumina raw reads to align sequences of all five *Neolamprologus* species against the high-quality *Oreochromis niloticus* linkage groups (i.e. chromosomes). The Lake Malawi cichlid *Metriaclima zebra* was included to break the longer branch to tilapia and improve phylogenetic reconstruction accuracy. Comparable sequence data sets for *N. brichardi* and *M. zebra* (Brawand *et al.* 2014) were chosen based on similarity in sequencing technology, read length, insert size, and the number of reads, and fastq files for these data sets were downloaded from the European Bioinformatics Institute (www.ebi.ac.uk/ena/data/view/SRR077345 and www.ebi.ac.uk/ena/data/view/SRR077295, respectively). Sequences for the 23

O. niloticus (Orenil1.1) linkage groups were downloaded from NCBI (http://www.ncbi.nlm.nih.gov/assembly/ GCF 000188235.2/) and merged into a single file, excluding any unplaced scaffolds and contigs. Given the good and similar quality of the new genomes, the raw, unfiltered reads for each species were then mapped to the indexed O. niloticus reference genome with BWA version 0.7.9a (Li & Durbin 2009) and a sorted BAM file was produced with SAMTOOLS version 1.0 (Li et al. 2009). The MARKDUPLICATES software from the PI-CARD-TOOLS version 1.107 package (http://broadinstitute.github.io/picard/) was used to identify and filter out duplicate reads from PCR. The deduplicated BAM files were then indexed, and a pileup file was created for each species. Per-base alignment qualities were recalculated and reads with mapping quality below 30 and base phred score below 30 were excluded while allowing 'orphan reads' (no read pair) to be kept in the file. The mean mapping coverage was 14.2× for N. brichardi,  $16.30 \times$  for M. zebra and  $15.0 \times -17.2 \times$  for the four newly sequenced Neolamprologus species (Figure S1, Supporting information). Importantly, only between 2.9% and 6.6% of the sites had a low but nonzero coverage between  $1 \times$  and  $4 \times$ , suggesting that few heterozygous sites were misidentified as homozygous. The pileup files were used to identify the variants and generate one VCF file per species with BCFTOOLS version 1.1 (invoking the 'call-c' option) (Li 2011). Special consideration was taken to circumvent alignment issues relating to indels. Species-specific insertions in the mapped genomes would not be phylogenetically informative for this type of analysis and would also be disregarded by the nature of the mapping approach. To maintain a consistent alignment length across all species, short deletions in the mapped species compared to O. niloticus were replaced with missing data ('n') in the VCF files. The VCF files were then converted into fastq file with vCFTOOLS version 0.1.12b (Danecek et al. 2011) and subsequently to fasta format using SEQTK v.1.0-r75 (https://github.com/lh3/seqtk), whereby heterozygous sites were incorporated by using IUPAC ambiguity codes. We generated alignment files for each linkage group by combining the fasta entries of O. niloticus, M. zebra and the five Neolamprologus species. All alignments were then manually inspected and alignment ends were trimmed (on the order of a few hundred bases due to repeats) to remove terminal regions in which none of the six mapped species had coverage.

## *Identification of chromosomal segments supporting different local topologies*

Phylogenetic relationships of genomic regions may differ from the species tree due to incomplete lineage sorting and introgression. To test whether this is the case for the five investigated genomes of *Neolamprologus*, and to detect breakpoints between genomic segments supporting different local topologies, we used the machine-learning approach implemented in SAGUARO version 0.1 (Zamani *et al.* 2013). SAGUARO does not require any a priori phylogenetic hypotheses, but infers similarity matrices and segment boundaries strictly from the genomic data. The analysis was performed jointly for alignments of all linkage groups, to improve inference of similarity matrices, which can map to multiple regions on different linkage groups. We constrained SAGUARO to use only nucleotide positions with less than 50% missing data and a minor allele frequency of two; otherwise, default parameters were applied.

We produced local alignments for all segments identified by SAGUARO, and inferred maximum-likelihood (ML) phylogenies for each alignment using RAXML version 8.1.17 (Stamatakis 2014). Due to the small number of taxa, we applied a GTR model (Tavaré 1986) of sequence evolution with no rate heterogeneity among sites (RAXML option-V) in each analysis. Outgroup positions were assumed for O. niloticus and M. zebra, relative to the five Neolamprologus species. Following ML analyses, topological support was assessed using bootstrapping (Felsenstein 1985) with the autoMRE bootstopping criterion. To identify a subset of segments with the most reliably inferred topologies, we filtered based on read coverage, alignment properties and tree support. Specifically, we included only segments with a minimum length of 500 000 bp, a maximum proportion of 50% of missing data per species, a mean phylogenetic bootstrap support of 80 (averaged over nodes) and a maximum proportion of 50% of alignment positions with low read coverage (less than  $3 \times$  in one or more of the newly sequenced genomes). By filtering out lowcoverage regions, we likely also reduced the number of heterozygous sites that falsely appeared as homozygous due to null alleles. A total of 224 segments distributed across all linkage groups fulfilled these criteria, to which we will refer as 'most reliable segments'. These contained a minimum of 4311 parsimony-informative sites per segment (median: 8258.5; mean: 11 477.4).

#### Inference of time-calibrated local phylogenies

To infer the root position and sequence of divergence events under a molecular clock model, we performed Bayesian phylogenetic analyses with the software BEAST version 2.2.0 (Bouckaert *et al.* 2014) for alignment blocks of 500 000 bp sampled from all 'most reliable segments', totalling 426 blocks (32.4% of all alignment sites). Each alignment block was analysed with three different models: (i) a strict molecular clock model

without rate variation across sites (GTR; 50 million Markov chain Monte Carlo (MCMC) generations); (ii) a strict molecular clock model with gamma-distributed rate variation across sites (GTR+Gamma; 100 million MCMC generations); and (iii) a relaxed-clock model with uncorrelated log-normal branch rate variation (100 million MCMC generations using the UCLN model of Drummond et al. 2006). We assumed outgroup positions for O. niloticus and M. zebra and used age estimates for the divergences of these two taxa according to McMahan et al. (2013) to time-calibrate the phylogeny. Despite a comparatively low number of temporal constraints used by McMahan et al. (2013), their estimated timeline of cichlid diversification is intermediate between those of other studies (Azuma et al. 2008: Friedman et al. 2013) and consistent with an endemic Lake Tanganyika radiation, which is supported by geomorphological evidence and by broader phylogenetic hypotheses of Lake Tanganyika cichlids (Cohen et al. 1993; Salzburger et al. 2005, 2014; Meyer et al. 2016). The divergence between Oreochromini (including O. niloticus) and Austrotilapiini (including M. zebra and Neolamprologus) was estimated by McMahan et al. (2013) to have occurred at 17.3-31.6 Ma, which we here modelled with a log-normal divergence prior distribution with offset 8.2 Ma, mean in real space 15.067 Ma and a standard deviation in log space of 0.24. In addition, the divergence event separating the Haplochromini (including M. zebra) and the Lamprologini (including Neolamprologus) was estimated at 12.7-24.7 Ma by McMahan et al. (2013), which we approximated with a log-normal prior distribution with offset 5.1 Ma, mean in real space 12.6 Ma and a standard deviation in log space of 0.24. Stationarity of MCMC chains was assessed by inspecting parameter traces and their effective sample sizes with TRACER version 1.6 (Rambaut et al. 2014). To test whether stationarity also indicated convergence, we repeated all analyses with different starting positions of the MCMC chain. The relative fit of the three models of molecular evolution was assessed a posteriori based on an Akaike information criterion through Markov chain Monte Carlo (AICM; Baele et al. 2012) analysis as implemented in TRACER version 1.6. After discarding the first 20% of posterior tree samples as burn-in, the remaining samples were used to calculate segment-specific maximum clade credibility (MCC) trees, with node heights set to mean posterior age estimates.

# *Three-taxon trees and genome-wide Patterson's D statistics*

To disentangle the effects of incomplete lineage sorting and introgression, which could both lead to incongruence between local phylogenies, we used local and genome-wide approaches. For the former, we calculated the numbers of phylogenies supporting distinct rooted topologies among sets of three *Neolamprologus* species. If the true species tree of three taxa A, B and C was ((A,B),C) and local phylogenies were affected by incomplete lineage sorting, we would expect to observe the alternative topologies ((A,C),B) and ((B,C),A) in roughly similar proportions. However, if local phylogenies differ due to introgression between C and either A or B, we would expect to see only one of the alternative topologies (unless introgression occurred in both A and B). Thus, frequencies of the observed topologies among three taxa can inform about the occurrence of incomplete lineage sorting and introgression.

In a genome-wide approach, we tested for excess of shared allelic variants in four-taxon comparisons using Patterson's D statistic (Green et al. 2010). This is the appropriate scale to use the *D* statistic, as the potential for erratic behaviour has been reported when applied to small genomic regions with low effective population size (Martin et al. 2015b). Assuming a species tree (((P1, P2),P3),O) of three species of Neolamprologus (P1-P3) and Metriaclima zebra as the outgroup (O), we counted the number of biallelic sites at which P1 and P3 ('BABA' sites) or P2 and P3 ('ABBA' sites) share the derived state. Under a null hypothesis of strict bifurcation without introgression, the frequencies of ABBA and BABA sites across the genome should not be significantly different. Thus, the reasoning behind this test is similar to the comparison of frequencies of segmentspecific topologies described above. In contrast to the segment-specific topology frequency comparison, however, this test does not depend on correct identification of segment boundaries and can be applied to the full genome alignment. Moreover, significance of the excess of ABBA or BABA sites can be assessed by calculation of the standard error and z-scores through a standard block jackknife procedure (Durand et al. 2011). Based on the results of our local phylogeny inference, we calculated the D statistic for ten sets of three Neolamprologus taxa (plus outgroup Metriaclima zebra) so that N. marunguensis was considered sister to two other species of Neolamprologus, whenever it was included. For comparisons excluding N. marunguensis, N. gracilis was assumed at the same position, and for one comparison excluding both N. marunguensis and N. gracilis, N. brichardi was used as the sister to N. olivaceous and N. pulcher. The length of jackknife blocks was set to 100 000 bp to account for nonindependence of sites due to linkage disequilibrium. Because we are interesting in ancient introgression events, only fixed SNPs were used in the calculations. These constitute the vast majority of the available data (Table S3, Supporting information).

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#### Maximum-likelihood tests of introgression

The observed frequencies of three-taxon gene trees and genome-wide D statistics allowed us to formulate explicit hypotheses of introgression and incomplete lineage sorting, which we then tested in a maximum-likelihood framework. These included three introgression events: between N. brichardi and N. pulcher, between N. marunguensis and the common ancestor of N. pulcher and N. olivaceous and between N. marunguensis and N. gracilis. We used the CalGTProb method (Yu et al. 2014) implemented in PHYLONET v.3.5.5 (Than et al. 2008) to first assess the likelihood of an introgressionfree species tree, given the set of 426 time-calibrated MCC topologies produced with BEAST. We then compared this likelihood to likelihoods of species trees with one to three reticulation edges, representing introgression events. Because the CalGTProb method assumes reticulation edges to be directional, indicating the donor and recipient of introgression, we tested both directions for each added reticulation edge and retained the edge direction that resulted in a better likelihood. As part of the analysis, weights of reticulation edges are estimated, which correspond to the proportion of the recipient's genome resulting from introgression (Yu et al. 2014).

## Timing of species divergences and introgression events

We further used the set of 426 time-calibrated local MCC phylogenies to infer divergence times and ages of introgression events. To do so, we sorted phylogenies into four partially overlapping subsets, for (i) phylogenies resulting from introgression from N. brichardi to N. pulcher, (ii) phylogenies affected by introgression from N. marunguensis to the common ancestor of N. olivaceous and N. pulcher, (iii) phylogenies likely to reflect introgression from N. marunguensis to N. gracilis and (iv) presumably introgression-free phylogenies. Specifically, we included all phylogenies with rooted topology IDs R6, R7, R10, R11, R13, R17 and R18 (see Supporting information), Table S4, in which N. brichardi appeared as the sister to N. pulcher, in subset (i), and phylogenies with topology IDs R4, R8, R9, R10, R12, R15, R16, R17, R18 and R19, in which N. marunguensis was the closest relative to N. olivaceous except N. pulcher, in subset (ii). Local phylogenies of the three taxa N. marunguensis, N. gracilis and N. brichardi appear to have been influenced by both incomplete lineage sorting and introgression. In the three-taxon comparison, N. marunguensis and N. gracilis were found as sister species in 149 local phylogenies, whereas N. marunguensis formed a clade with N. brichardi in 92 phylogenies. It is likely that the former 149 phylogenies reflect a mix of incomplete

lineage sorting and introgression, while the latter 92 phylogenies result from incomplete lineage sorting alone (Table S5 and Figure S2, Supporting information). As incomplete lineage sorting should affect both alternative topologies equally, we assume that the sister group relation between N. marunguensis and N. gracilis is due to incomplete lineage sorting in 92 of 149 phylogenies (with topology IDs R2, R4, R9, R11, R15, R16, R17 and R19) and due to introgression in the remaining 57 phylogenies. Under the assumption that the divergence of N. marunguensis and N. gracilis is younger when the sister group relationship is due to introgression rather than incomplete lineage sorting, we considered the 57 phylogenies with the youngest divergences between N. marunguensis and N. gracilis to reflect introgression from N. marunguensis to N. gracilis. To account for the potential bias due to rate variation in different genomic regions, we also used the relative node depth (RND; Rosenzweig et al. 2016) as a second criterion to identify phylogenies affected by introgression between N. marunguensis to N. gracilis. However, the set of 57 phylogenies with the lowest RND between N. marunguensis to N. gracilis was largely overlapping with the set of 57 phylogenies with the youngest divergences between these species (only four phylogenies were not found in both sets). Thus, we assumed that rate variation did not negatively influence our inference, and used the set based on absolute age estimates as subset (iii). All phylogenies that were not included in any of subsets (i)-(iii) were assumed to be unaffected by introgression and included in subset (iv). Subset (iv) was then used to calculate the ages of most recent common ancestors for all clades of the species tree, whereas divergence times in subsets (i)-(iii) were used to calculate the ages of introgression events. Note that the beginning of a reticulation edge may be older than its end if introgression did not proceed directly between the two species, but via unsampled species. We assume a single time point for each introgression event to be a reasonable assumption, given allopatry in Princess cichlids and the close proximity of bathymetric lines in the localities where the samples used here originate from (except for N. pulcher, which originates from the gentle Zambian coastal slopes) (Scholz et al. 2007). Proximity of bathymetric lines indicates that the coastline did not have dramatic changes in geographical coordinates during water-level fluctuations throughout the lake's history, which would minimize range changes and secondary contacts (Sturmbauer et al. 2001). Nevertheless, the possibility of multiple ancient introgression events involving the same set of species cannot be completely eliminated, a test of which would require the use of multiple populations per species.

## *Genome-wide landscape of recombination and introgression*

Because the linkage map of *Neolamprologus* is not yet known, we indirectly assessed its properties by looking at other molecular parameters that are known to directly correlate with recombination density. Assuming that recombination landscapes are conserved across *Neolamprologus* species and over the timescale of their diversification, a joint local increase in nucleotide diversity, GC content and sequence divergence across the five genomes would likely reflect an increase in local recombination rates (Kulathinal *et al.* 2008; Webster & Hurst 2012; Cutter & Payseur 2013; Roesti *et al.* 2013; Kawakami *et al.* 2014). In addition, we can use SAGUARO breakpoints between segments supporting alternative local topologies to learn about the distribution of the effective breaks (sensu Hanson 1959) that occurred between genomic regions with different evolutionary histories. We used the sum of branch lengths as a proxy for sequence divergence, unrooted topology U7 for introgression between N. marunguensis and the ancestor of N. pulcher and N. olivaceous, unrooted topology U12 for introgression between N. brichardi and N. pulcher, unrooted topology U13 as the species tree and all other unrooted topologies as trees affected by incomplete lineage sorting (see Fig. 1 and Table S6, Supporting information). Given that recombination breaks down linkage disequilibrium between loci that prevent interspecific gene flow, any departures from uniform introgression of segments or the number of bases would be informative about the ratio between selection and recombination in hybrids and the progress towards speciation (Barton & Bengtsson 1986; Baird 1995).



**Fig. 1** Distribution of chromosomal segments supporting the three most frequent unrooted local topologies. See Table 1 for further details. Numbers given next to phylogenies indicate topology IDs, as listed in Table S6. Unrooted topologies 7 and 12 support introgression from *N. marunguensis* into the common ancestor of *N. pulcher* and *N. olivaceous* and from *N. brichardi* into *N. pulcher*, respectively. Note that the unrooted topology 13 includes both the most likely species tree and rooted topology 2 (see Table S4). br, *N. brichardi*; gr, *N. gracilis*; ma, *N. marunguensis*; ol, *N. olivaceous*; pu, *N. pulcher*.

## Results

# Segments supporting local topologies along linkage groups

SAGUARO identified a total of 37 unique similarity matrices and 4781 genomic segments with a length between 21 and 10 613 497 bp (median 46 563 bp). For both the full set of segments and the subset of 224 'most reliable segments', we mapped occurrences of the three most frequently observed unrooted ML topologies of the five Neolamprologus species inferred in RAxML along the 23 linkage groups (Fig. 1, Table S6 and Figure S3, Supporting information). A single unrooted topology, in which N. gracilis appears as the sister to N. marunguensis, and N. olivaceous forms a clade with N. pulcher, was supported by nearly half (42.9%) of all segments and by the vast majority of the 'most reliable segments' (89.3%). Segments supporting this topology are significantly longer (*t*-test,  $P < 10^{-15}$ ) than all other segments and include the longest overall segment with a length of 10 613 497 bp on linkage group 7. Of all alignment sites, 71.9% are found in segments supporting this topology, and among the 'most reliable segments', this topology is supported by 91.1% of included sites.

## Time-calibrated local phylogenies

According to AICM, the strict molecular clock model with rate variation across sites (GTR+Gamma) was the best-fitting model for BEAST analyses of all 426 alignment blocks of 500 000 bp sampled from the 'most reliable segments', followed by the relaxed-clock model without rate variation across sites. For this reason, we here report the results for this model only while presenting more information about results with the other two models in Table S4 (Supporting information). Stationarity of MCMC was indicated by ESS values above 500 for all model parameters, and for all but four of the 426 alignment blocks (less than 1%), the two replicate analyses with different starting positions had converged on the same posterior distribution. The 426 time-calibrated MCC phylogenies represented 18 distinct rooted topologies, all of which are extremely well supported by mean Bayesian posterior probabilities (BPP) (mean BPP across all nodes in all phylogenies: 0.998; Table S4, Supporting information). Per-phylogeny mean age estimates for the first divergence among the five Neolamprologus species ranged from 1.67 to 7.28 Ma (median: 3.32; 2.5% quantile: 2.23; 97.5% quantile: 6.23). Neolamprologus marunguensis appeared as the sister to the four other Neolamprologus in 178 phylogenies, while N. gracilis and N. brichardi were found in the same position in 92 and 32 phylogenies, respectively. Mean ages of the most

recent common ancestor of the five *Neolamprologus* appeared older in phylogenies in which *N. marunguensis* was the first taxon to branch off (3.85 Ma), compared to phylogenies in which *N. gracilis* or *N. brichardi* were the first to diverge (3.71 and 3.22 Ma, respectively).

In the most frequently observed rooted topology, which is found in 129 phylogenies, N. olivaceous and N. pulcher are sister lineages and form a clade with N. brichardi, N. gracilis is the sister lineage to this clade, and N. marunguensis is the sister species to all of them. The same relationships among the first four species are also supported by the second- and third-most frequent topologies, found in 107 and 67 phylogenies, respectively. Thus, the three most common topologies only relationship of N. gracilis differ in the and N. marunguensis, which are sisters in 107 phylogenies, while N. gracilis is closer to the clade containing *N. olivaceous, N. pulcher* and *N. brichardi* in 129 phylogenies, but more distant than N. marunguensis in 67 phylogenies.

# Local and genome-wide measures of topological incongruence

We used the frequencies of local topologies in threetaxon comparisons to infer the relative contributions of incomplete lineage sorting and introgression to the observed incongruence (Table S5 and Figure S2, Supporting information). Neolamprologus olivaceous and N. pulcher form a clade in 385 of 426 MCC phylogenies (90.4%) in the comparison of N. olivaceous, N. pulcher and N. brichardi, suggesting that this topology reflects the species tree. In addition, a sister relationship between N. pulcher and N. brichardi is found in 41 MCC phylogenies, but not a single phylogeny supports N. olivaceous and N. brichardi to be sisters. This asymmetry between the frequencies of the two alternative topologies is highly unlikely to result from incomplete lineage sorting and thus suggests introgression between N. pulcher and N. brichardi. Similarly, a clade combining N. brichardi and either N. olivaceous or N. pulcher, relative to N. marunguensis, is found in 374 (88%) and 379 three-taxon comparisons (89%), respectively, which thus likely reflects the true species tree. The alternative topologies, however, are found with very different frequencies: N. marunguensis appear as sister to either N. olivaceous or N. pulcher in 50 and 45 phylogenies, respectively, but as the sister of N. brichardi in only two phylogenies. As this asymmetry is almost identical regardless of whether N. olivaceous or N. pulcher are used in the comparison, it suggests ancient introgression between N. marunguensis and the common ancestor of N. olivaceous and N. pulcher. Finally, in the comparison of N. brichardi, N. gracilis and N. marunguensis, all three possible topologies are found with high frequency, with 185 (43%) phylogenies supporting the most frequent topology in which N. brichardi and N. gracilis are sisters. The alternative sister group relationships of N. marunguensis with either N. brichardi or N. gracilis are found in 92 (22%) and 149 (35%) phylogenies, respectively. Assuming that the most frequent topology represents the true species tree, differences between these frequencies may be explained by (i) incomplete lineage sorting stochastically leading to minor asymmetry of alternative topologies, (ii) incomplete lineage sorting followed by introgression between N. marunguensis and N. gracilis or (iii) independent introgression between N. marunguensis and both N. brichardi and N. gracilis.

Using genome-wide tests of excess of shared variants (commonly known as ABBA-BABA tests), we find considerable support for introgression as the most likely explanation for the observed patterns of allele sharing. Considering absolute *z*-scores greater than 3 to be significant (Freedman et al. 2014), the null hypothesis of strict bifurcation could be rejected for all but one of the fourtaxon comparisons (Table S7, Supporting information). Three comparisons produce particularly strong support for introgression, with D statistics < -0.15 and absolute z-scores around 60: Neolamprologus brichardi shared substantially more variants with N. pulcher than with N. olivaceous (241 165 vs. 152 641; D: -0.2248; z: -61.99) and N. marunguensis shares a similar excess of variants with both N. pulcher (279 544 vs. 204 089; D: -0.1560; z: -59.63) and N. olivaceous (340 115 vs. 246 644; D: -0.1593; z: -59.62), compared to N. brichardi. These test results are consistent with our interpretation of topology frequencies in local phylogenies and further support introgression between N. pulcher and N. brichardi and between N. marunguensis and the common ancestor of both N. olivaceous and N. pulcher. In addition, N. marunguensis shares substantially more variation with N. gracilis than with N. brichardi (335 990 vs. 276 474; D: 0.0972; z: 27.01). This excess mirrors the asymmetry observed in frequencies of rooted topologies for these three taxa and supports a third case of introgression between N. marunguensis and N. gracilis.

#### Maximum-likelihood tests of introgression

Using PHYLONET, we found that the addition of a reticulation edge allowing introgression from *N. brichardi* to *N. pulcher* improves the likelihood by 26.83 log units compared to the introgression-free species tree. About 9% of the genome of *N. pulcher* is estimated to have originated from *N. brichardi* via introgression along this reticulation edge. Adding a second reticulation edge between *N. marunguensis* and the common ancestor of *N. olivaceous* and *N. pulcher* further improves the likelihood by another 14.01 log units, and circa 15% of the genome of this ancestor is estimated to have originated from introgression. Finally, a third reticulation edge allowing for introgression from *N. marunguensis* to *N. gracilis* additionally improves the likelihood by 16.64 log units, and over 25% of the *N. gracilis* genome is estimated to have derived from *N. marunguensis* (Table S8, Supporting information). Taken together, at least three cases of introgression are strongly supported between the five *Neolamprologus* species or their ancestors.

#### Timing of species divergences and introgression events

Based on the above considerations about inferred introgression events, we used different subsets of trees to calculate the time-calibrated species tree and the timings of introgression (Fig. 2). Diversification of the group is recent and occurred most likely during the Pliocene and Pleistocene, but not earlier than the Late Miocene. Speciation at the base of the tree seems to have been particularly fast, with *N. marunguensis* and *N. gracilis* diverging from their common ancestors almost simultaneously. Speciation of *N. brichardi, N. olivaceous* and *N. pulcher* succeeded approximately 1 Ma apart. The three inferred



Fig. 2 Time-calibrated species tree of the five *Neolamprologus* and outgroup species inferred with BEAST. Arrows indicate the three most supported introgression events, their mean ages and proportions of introgressed genome. Diversification in this group of *Neolamprologus* took place in the Pliocene and Pleistocene, during the fully lacustrine conditions of Lake Tanganyika. Introgression occurred from 'older' into 'younger' species, possibly indicating a creative role for interspecific gene flow.

introgression events probably occurred at different times (Table S9, Supporting information).

## Genome-wide landscape of recombination and introgression

We found small but significant effects of chromosomal position on nucleotide diversity, sequence divergence and GC content (Fig. 3). Nucleotide diversity (t = 11.34;  $P < 2.2 \times 10^{-16}$ ; adjusted R = 0.161), sequence divergence (t = 7.68;  $P = 1.9 \times 10^{-14}$ ; adjusted  $\hat{R} = 0.110$ ) and GC content (t = 8.51;  $P < 2.2 \times 10^{-16}$ ; adjusted R = 0.121) all increase with distance from the chromosome centre. Nucleotide diversity and sequence divergence are also positively correlated (t = 34.52;  $P < 2.2 \times 10^{-16}$ ; adjusted R = 0.447, not shown). Increases in nucleotide diversity, sequence divergence and GC content are known effects of increased local recombination (Webster & Hurst 2012), which indicates that the recombination landscape is not uniform along the chromosomes of (Neolamprologus) cichlids and that its density increases towards chromosomal ends. Using breakpoint information and segments that support different local topologies from SAGUARO, we found increasing number of segments away from the chromosome centre, indicating an increase in the number of effective recombination events (Kolmogorov-Smirnov two-sided test for uniform distribution of segments: D = 0.11574;  $P < 2.2 \times 10^{-16}$ ; segment size: t = -7.11;  $P < 1.4 \times 10^{-12}$ ; adjusted R = 0.101). Finally, we found that introgression is not uniform along the chromosomes (Fig. 4). In particular, introgressed segments are more abundant towards the periphery of linkage groups and

not uniformly scattered around the genome (introgression from *N. marunguensis*: Kolmogorov–Smirnov two-sided test: D = 0.12;  $P = 6.5 \times 10^{-11}$ ; introgression from *N. brichardi*: D = 0.16;  $P = 4.7 \times 10^{-8}$ ). The proportion of introgressed bases also increases away from the chromosome centre (introgression from *N. marunguensis*: t = 3.99;  $P = 1.29 \times 10^{-4}$ ; adjusted R = 0.362; introgression from *N. brichardi*: t = 1.69; P = 0.094; adjusted R = 0.136), as does the proportion of bases supporting incomplete lineage sorting and other phylogenetic noise (t = 3.20;  $P = 1.85 \times 10^{-3}$ ; adjusted R = 0.292). In the opposite direction, the proportion of bases supporting the correct species tree decreases with distance from the chromosome centre (t = -5.67;  $P = 1.4 \times 10^{-7}$ ; adjusted R = 0.489).

## Discussion

## The Neolamprologus species tree, incomplete lineage sorting and introgressive hybridization

Here, we illuminate the complex evolutionary history of a highly diverse group of East African cichlid fishes that were previously shown to be involved in introgressive hybridisation (Salzburger *et al.* 2002; Gante & Salzburger 2012). By employing a combination of whole-genome sequencing and phylogenomic analyses of five closely related *Neolamprologus* species, we determined the most likely species tree, found concordant evidence for incomplete lineage sorting or interspecific gene flow affecting different branches of the phylogeny and determined the direction and timing of introgression events involving these species.

> Fig. 3 Bias in the genomic distribution of molecular parameters, all segment topologies considered. In (a), the number of segments increases with distance from chromosome centre; that is, the number of breakpoints between segments increases, indicating that recombination rate is lowest closer to the chromosome centre. In (b), (c) and (d), nucleotide diversity, branch lengths (used as a proxy for sequence divergence) and GC content, respectively, all increase with distance from chromosome centre. These parameters are known to correlate with recombination rate, supporting the use of breakpoint data to infer the recombination landscape.







**Fig. 4** Bias in the genomic distribution of introgression and incomplete lineage sorting. In (a), the number of segments with unrooted topology 7 (introgression from *N. marunguensis* to the ancestor of *N. pulcher* and *N. olivaceous*) and (b) the number of segments with unrooted topology 12 (introgression between *N. brichardi* and *N. pulcher*) are lowest closest to the chromosome centre and increase towards the periphery. In (c), we show the linear relation between the proportion of bases supporting different topologies and chromosome position. The proportion of bases supporting introgression (U7 and U12) also increases with distance from chromosome centre, as does the proportion of bases supporting the species tree (U13) decreases with increasing distance from chromosome centre. In Figure S4 (Supporting information), we show the same data as in (c) fitted with polynomial functions. The results are qualitatively the same, except that the more complex polynomial functions are better in describing the relationship between distance from chromosome compositions are better in describing the relationship between distance from chromosome centre.

While it has been shown that with high levels of introgression, the most frequently observed topology can differ from the actual species tree (e.g. Fontaine et al. 2015), we here conclude that this is not the case for the five Neolamprologus species, based on several lines of evidence. First, the most common topology can usually be considered the most probable species tree topology unless additional evidence supports a different scenario. Second, the unrooted topology (U13) corresponding to the most frequent rooted topology (R1) is predominantly found in low-recombination regions in the centre of chromosomes (Figs 1 and 4), which are known to support the true species tree topology more reliably than regions with high recombination (Pease & Hahn 2013). Third, the age estimate for the divergence of Neolamprologus is older for trees with the most frequent rooted topology (R1), compared to trees with other frequently occurring topologies (R2, R3; Table S4, Supporting information) in which divergence age estimates may have been reduced due to introgression. Thus, the most likely species tree is concordant with the most frequently observed rooted tree topology (R1), in which N. olivaceous and N. pulcher are sister lineages and form a clade with N. brichardi, with N. gracilis being their sister lineage and N. marunguensis being the sister species to all of them. This species tree suggests that the organized facial pigmentation, characteristic of many of the 'Princess cichlids' (Bachmann et al. 2016), evolved within this group of pigmented species from nonpigmented cooperatively breeding ancestors (Fig. 2).

As expected for rapidly diversifying taxa, we found evidence for incomplete lineage sorting affecting short internodes in the species tree (Pease & Hahn 2013), in particular at the base of *Neolamprologus* and involving *N. brichardi*, *N. gracilis* and *N. marunguensis*. Patterns of allele sharing and marker incongruence are known to affect the phylogenies of diverse groups, cichlids in particular (Rüber *et al.* 2001; Koblmüller *et al.* 2007, 2010; Joyce *et al.* 2011; Genner & Turner 2012; Schwarzer *et al.* 2012; Keller *et al.* 2013; Wagner *et al.* 2013; Brawand *et al.* 2014; Ford *et al.* 2015; Martin *et al.* 2015a; Meyer *et al.* 2015b. Nevertheless, we were able to disentangle the effects of incomplete lineage sorting from those of introgression. This allowed us to test the hypothesis of hybrid origin of *N. marunguensis* (Salzburger *et al.* 2002) and to explore the causes for polyphyly in the relationship between *N. brichardi* and *N. pulcher* (Duftner *et al.* 2007).

Incongruent mitochondrial patterns of and microsatellite allele sharing among N. marunguensis, N. gracilis and N. olivaceous suggested that the first could be of hybrid origin (Salzburger et al. 2002), although multilocus nuclear AFLP (amplified fragment length polymorphism, a restriction enzyme-based method) supported their reciprocal monophyly (Sturmbauer et al. 2010). While we confirm episodes of introgressive hybridization involving these three species, in proportions similar to those observed in Heliconius butterflies (Martin et al. 2013), our results indicate an alternative scenario of introgression: based on whole genomes, we show that N. marunguensis was the donor of substantial proportions of genetic material to N. gracilis and to N. olivaceous (and N. pulcher), rather than being a recipient, hybrid species. Thus, we find no support for the hybrid origin hypothesis of N. marunguensis (Salzburger et al. 2002), which is not surprising given

the extreme difficulty in robustly distinguishing hybrid speciation from introgressive hybridization, particularly when the original hypotheses are based on a few neutral genetic markers without reference to adaptive hybrid traits (Mallet 2007; Jiggins *et al.* 2008). Our findings using whole genomes enlarge the pool of genome-wide studies that reject previous hybrid origin hypotheses in animals (e.g. Meyer *et al.* 2006; Schumer *et al.* 2013), even in systems where hybrid trait speciation has found strong support, like in *Heliconius* butterflies (Mavárez *et al.* 2006; Kronforst *et al.* 2007; Salazar *et al.* 2010). This current tendency of rejecting possible instances of hybrid speciation based on genome-wide data raises the possibility that homoploid hybrid speciation may in fact be exceptionally rare in animals.

In addition, we find strong evidence for nuclear introgression from N. brichardi into N. pulcher. These species were previously found to be polyphyletic based on mitochondrial DNA sequences, but reciprocally monophyletic based on AFLP data (Duftner et al. 2007; Sturmbauer et al. 2010). In addition, while N. olivaceous and N. pulcher were consistently placed into divergent mitochondrial lineages within the lamprologines (Salzburger et al. 2002; Day et al. 2007; Duftner et al. 2007; Sturmbauer et al. 2010), a sister species relationship is strongly supported by our genome-wide analyses. In the light of these results, we reinterpret the previously reported mitochondrial polyphyly as resulting from widespread mitochondrial introgression rather than a lack of distinctiveness between N. brichardi and N. pulcher (Duftner et al. 2007). The distant relationship between N. olivaceous and other Neolamprologus (namely N. pulcher) inferred from mtDNA also likely reflects ancient mitochondrial introgression. Altogether, these results point towards a bias in nuclear vs. mitochondrial introgression (Chan & Levin 2005; Carson & Dowling 2006; Good et al. 2015; Patten et al. 2015): N. marunguensis acts as a major donor of nuclear genes, while it is also a receiver of mitochondrial genomes, at least in some populations. Whether alternative mitochondrial lineages have become fixed in different allopatric populations, or have been entirely replaced in some species, is presently unknown but is a plausible scenario, particularly in N. pulcher and N. olivaceous (see Nevado et al. 2009 for another Lamprologini example).

# Speciation and introgression in Lamprologini and other cichlids

The tribe Lamprologini, to which *Neolamprologus* belongs, is the most species rich and also one of the most phenotypically diverse (in morphology, behaviour, life history) lineages of cichlids in Lake Tanganyika (Stiassny 1997; Gante & Salzburger 2012). We are just

starting to acknowledge the various trophic adaptations (Muschick et al. 2012) and behaviours (Heg & Bachar 2006) that likely contributed to the lineage's evolutionary success. In addition, their genomes are very dynamic compared to Nile tilapia and other teleost genomes, with new gene duplications, accelerated coding sequence evolution, an abundance of noncoding element divergence, expression divergence linked to transposable element insertions, regulation by novel microRNAs (Brawand et al. 2014) and extensive introgressive hybridization as shown here and elsewhere (Salzburger et al. 2002; Schelly et al. 2006; Day et al. 2007; Koblmüller et al. 2007, 2010; Nevado et al. 2009; Sturmbauer et al. 2010). While the proximate consequences of introgression remain unknown in lamprologines, it seems to have occurred throughout their evolutionary history, in contrast with cichlids from other African Great Lakes where introgression has been hypothesized to fuel the onset of adaptive radiations (Seehausen 2004).

Given that many lamprologine species have demelike allopatric distributions, frequently fragmented and interspersed by other species, the alternation between periods of sympatry and allopatry could be driving introgression and the evolution of the lamprologines' genomes as we know them. During periods in allopatry, differences should accumulate in chromosome centres, while gene flow should resume to a greater extent in chromosome ends in periods of sympatry, recombination and selection permitting. Lake-level fluctuations, which have happened multiple times during the complex geological and palaeo-climatological history of Lake Tanganyika (Cohen et al. 1997; Salzburger et al. 2014), are potential drivers of changes in species ranges (Sturmbauer et al. 2001). Therefore, it is possible that the patterns of gene flow observed in Neolamprologus have involved species or populations in addition to the ones studied here and that different demes of each species tell a different story of gene flow and incomplete lineage sorting. It is also very likely that introgressive hybridization has also occurred at higher taxonomic levels, such as between tribes, or at the genesis of hybrid tribes, which would explain the difficulties in generating well-supported nuclear phylogenies of the cichlid assemblage from Lake Tanganyika (Meyer et al. 2015, 2016). Another fascinating aspect of the cichlid model systems is the emergence of parallel phenotypes in different cichlid lineages, as well as convergence at the molecular level (Salzburger 2009). Whole-genome data will allow testing whether these were generated de novo or recycled from pre-existing variation through introgression, transferring 'recycled genetic pathways and phenotypes' across geographical scales, even between lakes thought to be watertight (Jiggins 2014).

#### Recombination bias, linked selection and introgression

We found significant correlations between chromosomal position and several molecular parameters, such as nucleotide diversity, sequence divergence and GC content, all of which increase towards the chromosome periphery, likely modulated by recombination rate as seen in a number of other systems (Begun & Aquadro 1992; Hellmann et al. 2003; Begun et al. 2007; Kulathinal et al. 2008; Sella et al. 2009; McGaugh et al. 2012; Roesti et al. 2013; Campos et al. 2014; Good et al. 2014; Kawakami et al. 2014; Tine et al. 2014; Burri et al. 2015). An increase in recombination rate with increased distance from chromosome centres is in line with observations from pedigree studies (Jensen-Seaman et al. 2004; Backström et al. 2010; Niehuis et al. 2010; Brunschwig et al. 2012; Tortereau et al. 2012; Roesti et al. 2013; Kawakami et al. 2014; Burri et al. 2015; Phillips et al. 2015). Because cichlids have mostly acrocentric, subtelocentric and telocentric chromosomes (Mazzuchelli et al. 2012), the observed patterns of variation from centre to periphery are likely not driven by centromere position.

In addition, SAGUARO breakpoint density also increases towards the end of chromosomes in Neolamprologus, indicating that effective recombination events (between stretches of DNA with different evolutionary histories, sensu Hanson 1959) are not uniformly distributed along the chromosomes. In fact, we observe increased introgression towards the chromosome periphery, which suggests that selection is shaping the genomic architecture as a function of recombination rate. Cline theory predicts that recombination rate influences the magnitude of selection at linked loci: barriers to gene flow are more effective in regions of low recombination, while increased recombination makes selection more efficient at individual loci, thereby reducing Hill-Robertson interference and allowing the introgression of neutral or positively selected loci (Haldane 1948; Hill & Robertson 1966; Barton 1983; Barton & Hewitt 1985; Barton & Bengtsson 1986; Baird 1995; Gavrilets 2004; Charlesworth 2009; Bierne et al. 2011; Flaxman et al. 2014; Roesti et al. 2014). This is so because larger segments are more likely to harbour alleles that are deleterious in a hybrid background and are removed by selection before recombination can occur, and thus, effective introgression is more likely in regions where linkage is more rapidly broken down by recombination (Barton 1983; Barton & Hewitt 1985; Barton & Bengtsson 1986; Baird 1995; Martinsen et al. 2001). Still in the absence of recombination biases, theory predicts that the strength of a barrier to gene flow is stronger at the chromosome centre than at its periphery (Barton & Bengtsson 1986), even if we observe an increase in nucleotide diversity, sequence divergence and GC content suggestive of some degree of recombination bias.

Reduced introgression has been predicted and indeed observed in regions of low recombination, such as inversions and around centromeres, which have long been thought to contribute to the accumulation of genetic differences between species (e.g. Rieseberg et al. 1999; Butlin 2005; Turner et al. 2005; Kirkpatrick & Barton 2006; Yatabe et al. 2007; Kulathinal et al. 2009; Carneiro et al. 2010; Geraldes et al. 2011; Ellegren et al. 2012; Nachman & Payseur 2012; Lohse et al. 2015; Roesti et al. 2015), although high differentiation could also be driven by linked selection alone (Burri et al. 2015). Here, we show that collinear regions with low recombination are also more resistant to introgression. Hence, isolation (speciation) genes can accumulate in different lowly recombining regions without the restrictive precondition of close physical proximity, generating unlinked islands of differentiation. Therefore, these regions simultaneously show reduced gene flow and reduced diversity. Our results support a scenario in which 'genomic islands of differentiation' behave simultaneously as regions of low recombination and low introgression, resolving an artificial dichotomy between potentially complementary processes (Cruickshank & Hahn 2014). Effective introgression of small-sized segments broken down by repeated recombination is then more likely with increasing distance from the chromosome centre. Peripheral regions experiencing higher recombination and more effective selection regimes thus show increased evolvability and are likely better at responding to changes in spatially or temporally heterogeneous environments (Tigano & Friesen 2016). Conversely, chromosome centres with lower recombination experience higher interference, increased coupling and lower introgression. Linkage disequilibrium can thus be created and maintained without the need for tight physical linkage, perhaps in structured populations or after a period of allopatry. Intrinsic Bateson-Dobzhansky-Muller incompatibilities fit right in this scenario (Coyne & Orr 2004; Gavrilets 2004).

## *Implications of heterogeneous recombination landscapes for speciation in Neolamprologus and other systems*

The recurrent emergence of genomic regions that simultaneously show high differentiation (reduced gene flow) and low genetic diversity across taxa suggests that shared genomic features contribute to the build-up of genomic islands of differentiation and speciation (Chowdhury *et al.* 2009; Kulathinal *et al.* 2009; Rockman & Kruglyak 2009; Backström *et al.* 2010; Bradley *et al.* 2011; Roesti *et al.* 2013; Kawakami *et al.* 2014; Burri *et al.* 2015). Indeed, heterogeneous yet collinear genomes are generated by biases in recombination rate across the chromosome (chromosome centre-biased divergence, sensu Roesti et al. 2012). These biases generate slowerevolving, less-diverse and introgression-resistant chromosome centres that can act as 'centres of incompatibility', while the faster-evolving, more-diverse and more mutation- and gene flow-prone chromosome ends are 'peripheries of evolvability', that is regions where molecular adaptations can originate at a faster pace and spread across the population. Based on these findings, we anticipate that genomic landscapes modulated by recombination and selection relate to observed levels of taxonomic and phenotypic diversity in cichlids and other taxa with collinear genomes, linking genomic architecture to observed phenotypic diversity. While more complex and realistic models and simulations are already being developed (e.g. Flaxman et al. 2012, 2013, 2014; Roesti et al. 2014), promising approaches should incorporate and explore the pervasive effects of heterogeneous genomic landscapes and selection at linked sites on speciation, adaptation and gene flow.

The fact that we observe this dichotomy between chromosome centres and periphery in *Neolamprologus* could explain, from a genomic perspective, both the high speciation rate and extreme adaptability observed in African cichlid radiations. The cichlid system offers an ideal opportunity to further test the intrinsic properties of genomes in driving speciation and adaptation, as cichlids are composed of several lineages with various levels of taxonomic and phenotypic diversity (Gante & Salzburger 2012).

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H.F.G., S.J. and W.S. designed the research; H.F.G. and Ma.M. performed wet laboratory analysis; Ma.M. involved in genome assembly and whole-genome mapping; Mi.M. and H.F.G. involved in statistical analyses; H.F.G., Mi.M., and Ma.M. wrote manuscript with input from all coauthors.

#### Data accessibility

Raw sequencing reads associated with this study are available at the European Nucleotide Archive's Short Read Archive (http://www.ebi.ac.uk/ena; primary and secondary accession nos PRJEB12322 and ERP013786). RAxML trees and alignment files are available at Dryad Repository (doi:10.5061/dryad.jr67t). An 'Introgression tutorial' focusing on the implementation of phylogenomic methods (SAGUARO, BEAST and PHYL-ONET) by Mi.M is available at https://github.com/ mmatschiner/Introgression-Tutorial.

#### Supporting information

Additional supporting information may be found in the online version of this article.

Fig. S1 Distribution of mapping coverage across the five *Neo- lamprologus* and *M. zebra*.

Fig. S2 Frequencies of local topologies in three-taxon comparisons.

Fig. S3 Distribution of chromosomal segments supporting the three most frequent unrooted local topologies.

Fig. S4 Bias in the genomic distribution of introgression and incomplete lineage sorting.

Table S1 Locality information of sequenced species.

**Table S2** Coverage and numbers of partial and complete core genes for each of the newly sequenced genomes.

**Table S3** Number of fixed and polymorphic single nucleotide polymorphisms across the five *Neolamprologus* and *M. zebra* relative to *O. niloticus*.

**Table S4** Numbers of chromosomal segments, mean Bayesian posterior probabilities (BPP) and median ages of alternative rooted topologies of five taxa identified by BEAST.

**Table S5** Frequencies of local topologies in three-taxon comparisons and hypotheses of incomplete lineage sorting and introgression.

**Table S6** Numbers of chromosomal segments and sites, and median length of segments supporting alternative unrooted topologies of five taxa identified by SAGUARO.

**Table S7** ABBA-BABA genome-wide tests of shared variants in four-taxon comparisons using Patterson's *D* statistic.

 Table S8 Maximum-likelihood tests of reticulation using PhyloNet.

Table S9 Ages (in million years) of all clades and inferred introgression events.