# Research

# Whole genome sequencing of multiple Leishmania donovani clinical isolates provides insights into population structure and mechanisms of drug resistance

Tim Downing,<sup>1,10</sup> Hideo Imamura,<sup>2,10</sup> Saskia Decuypere,<sup>2</sup> Taane G. Clark,<sup>3</sup> Graham H. Coombs,<sup>4</sup> James A. Cotton,<sup>1</sup> James D. Hilley,<sup>5</sup> Simonne de Doncker,<sup>2</sup> Ilse Maes,<sup>2</sup> Jeremy C. Mottram,<sup>5</sup> Mike A. Quail,<sup>1</sup> Suman Rijal,<sup>6</sup> Mandy Sanders,<sup>1</sup> Gabriele Schönian,<sup>7</sup> Olivia Stark,<sup>7</sup> Shyam Sundar,<sup>8</sup> Manu Vanaerschot,<sup>2</sup> Christiane Hertz-Fowler,<sup>1,9</sup> Jean-Claude Dujardin,<sup>2,11</sup> and Matthew Berriman<sup>1,11</sup>

<sup>1</sup>Wellcome Trust Sanger Institute, Wellcome Trust Genome Campus, Hinxton CB10 1SA, United Kingdom; <sup>2</sup>Unit of Molecular Parasitology, Department of Parasitology, Institute of Tropical Medicine, 2000 Antwerp, Belgium; <sup>3</sup>London School of Hygiene and Tropical Medicine, Keppel Street, London WC1E 7HT, United Kingdom; <sup>4</sup>Strathclyde Institute of Pharmacy and Biomedical and Sciences, University of Strathclyde, Glasgow G4 0RE, United Kingdom; <sup>5</sup>Wellcome Trust Centre for Molecular Parasitology, Institute of Infection, Immunity and Inflammation, College of Medical, Veterinary and Life Sciences, University of Glasgow, Glasgow G12 8TA, Scotland, United Kingdom; <sup>6</sup>B.P. Koirala Institute of Health Sciences, Ghopa, Dharan, Nepal; <sup>7</sup>Institut für Mikrobiologie und Hygiene, Charité Universitätsmedizin Berlin, 10117 Berlin, Germany; <sup>8</sup>Institute of Medical Sciences, Banaras Hindu University, Varanasi, India

Visceral leishmaniasis is a potentially fatal disease endemic to large parts of Asia and Africa, primarily caused by the protozoan parasite Leishmania donovani. Here, we report a high-quality reference genome sequence for a strain of L. donovani from Nepal, and use this sequence to study variation in a set of 16 related clinical lines, isolated from visceral leishmaniasis patients from the same region, which also differ in their response to in vitro drug susceptibility. We show that wholegenome sequence data reveals genetic structure within these lines not shown by multilocus typing, and suggests that drug resistance has emerged multiple times in this closely related set of lines. Sequence comparisons with other Leishmania species and analysis of single-nucleotide diversity within our sample showed evidence of selection acting in a range of surface- and transport-related genes, including genes associated with drug resistance. Against a background of relative genetic homogeneity, we found extensive variation in chromosome copy number between our lines. Other forms of structural variation were significantly associated with drug resistance, notably including gene dosage and the copy number of an experimentally verified circular episome present in all lines and described here for the first time. This study provides a basis for more powerful molecular profiling of visceral leishmaniasis, providing additional power to track the drug resistance and epidemiology of an important human pathogen.

[Supplemental material is available for this article.]

Leishmaniases are a complex of diseases that range from self-curing lesions to gross disfigurations and potentially deadly visceral disease. The diseases are caused by protozoan parasites that are transmitted by sandflies in 88 countries and infect an estimated 12 million people (www.who.int/leishmaniasis/en/). Parasites of the Leishmania genus are remarkably biologically, clinically, and epidemiologically diverse and present enormous differences in disease tropism. The mildest form is cutaneous leishmaniasis, which is caused by Leishmania major and other species, and is largely

<sup>9</sup>Present address: Centre for Genomic Research, Institute of Integrative Biology, Biosciences Building, University of Liverpool, Crown Street,

Liverpool L69 7ZB, U.K.<br><sup>10</sup>These authors contributed equally to this work.<br><sup>11</sup>Corresponding authors.

- E-mail jcdujardin@itg.be.
- E-mail matthew.berriman@sanger.ac.uk.

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limited to lesions around the area of a sandfly bite—though a diffuse form can also occur. Disfiguring mucocutaneous leishmaniasis is due to the destruction of nasopharyngeal tissue by parasites such as L. braziliensis. More significantly, visceral leishmaniasis is caused by parasites of the L. donovani species complex that can spread to internal organs and cause death.

In 2005, sequencing the genome of L. major identified 8311 protein-coding genes and provided a framework for future comparative genomic studies (Ivens et al. 2005). The genome elucidated the full structural architecture of Leishmania chromosomes, which includes an unusual pattern of genes distributed in large directional clusters. Subsequently, the genomes of L. braziliensis and L. infantum were described—the latter is a member of the L. donovani complex (Peacock et al. 2007). A detailed comparison of these first three Leishmania genomes revealed a striking background of conservation at the gene-content level with almost complete synteny. Moreover, in stark contrast to the major phenotypic differences caused by each species, less than 50 genes were

differentially distributed, indicating that few genuinely speciesspecific genes may exist. This study, however, only honed in on the presence or absence of orthologs. It did not include other classes of diversity, such as structural polymorphisms within tandem arrays or the generation of episomes; both of which have subsequently been described as differing considerably between Leishmania lines and as contributing substantial differences to gene expression (Dujardin 2009; Leprohon et al. 2009a,b). Furthermore, the genome of L. donovani has thus far not been examined, despite it being arguably the most important Leishmania species in terms of public health, and being genetically distinct from L. infantum (Lukes et al. 2007). Both in terms of mortality and morbidity, L. donovani causes a major part of the leishmaniasis burden, in East Africa and the Indian subcontinent (Rijal et al. 2010).

In the present study, we aimed to explore the intraspecies genomic diversity of Leishmania in a clinical context. The first regional program of visceral leishmaniasis elimination is targeting L. donovani in Bangladesh, India, and Nepal (Mondal et al. 2009). However, emerging drug resistance is compromising current efforts. Understanding the L. donovani genome and its natural variation and genetic population structure in these regions is therefore essential to underpin and enhance public health surveillance and intervention strategies.

We focused specifically on *L. donovani* populations from the Terai region of Nepal and the state of Bihar in India. These populations constitute an ideal genomic model in which genetic variation between samples should be reduced: Indeed, these parasites are relatively homogeneous, likely as a result of a demographic bottleneck in the 1960s, after DDT spraying campaigns (WHO Expert Committee on the Control of the Leishmaniases 2010). In addition, these isolates were the subjects of several recent studies, providing a unique clinical, biological, and epidemiological background (Decuypere et al. 2005, 2008; Laurent et al. 2007; Alam et al. 2009; Rijal et al. 2010; Vanaerschot et al. 2010). Importantly, these parasites are highly variable in terms of susceptibility to antimonial drugs such as sodium stibogluconate (SSG; Rijal et al. 2007; Samant et al. 2007; Kumar et al. 2009).

Using a combination of 454 Life Sciences (Roche) and Illumina sequencing technologies, we have generated a high-quality and annotated draft genome for L. donovani. We have subsequently used this reference genome as a framework to map natural variation data collected from deep resequencing of 16 further Nepalese and Indian clinical lines. By discovering genome-wide singlenucleotide polymorphisms (SNPs) and structural variation (SV), we identified genes with differential patterns of diversity in antimonial resistant and susceptible samples. Both tests for adaptive evolution across SNPs and assessments of copy-number variation (CNV) highlighted subsets of protein-coding genes undergoing adaptive evolution in the L. donovani population. As expected, we saw a low level of SNP variation; but despite this, we report striking structural polymorphisms that may result in locus-specific changes to gene dosage. These include extensive chromosomal CNVs as well as the generation of extrachromosomal circular fragments.

# Results

#### Generation of an annotated L. donovani reference genome

To investigate natural genetic variation in L. donovani, we selected a single cloned line (BPK282/0cl4) from Nepal to use as a reference and sequenced its genome by combining single and paired-end reads from the 454 GS FLX Titanium platform (median 22-fold coverage) with reads from Illumina Genome Analyzer (median 52 fold coverage). The 454 data were assembled de novo, and the Illumina data were used to iteratively correct errors in the consensus sequence and close gaps (Supplemental Fig. S1). The initial set of contigs—50% of which were 44.4 kb or greater (N50)—were aligned, ordered, and oriented against the L. infantum JPCM5 reference genome (Peacock et al. 2007) to produce an assembled highquality draft L. donovani genome of length 32.4 Mb containing 2154 contigs and with a final N50 of 45.5 kb.

The reference genome was annotated by identifying orthologous genes within the *L. infantum* genome and transferring their annotation onto the L. donovani draft assembly. Of the 8395 genes in the L. infantum genome (Peacock et al. 2007), 8252 were transferred to L. donovani using RATT (Otto et al. 2011). These included 33 genes assigned to 15 L. donovani contigs that could not be uniquely associated with a chromosome; most of these genes occurred in arrays with homology with multiple regions in the L. donovani genome (Supplemental Tables S1, S2). A total of 143 genes were not transferred from L. infantum because they occurred within repetitive gene arrays, had multiple paralogs in L. infantum, matched multiple regions, or were located in regions for which local synteny was unresolved in L. donovani.

The L. donovani reference sequence was aligned to each of the other previously described Leishmania genomes (L. infantum, L. major, and L. braziliensis) (Peacock et al. 2007) and the recently sequenced L. mexicana genome (Rogers et al. 2011). This highlighted substantial genetic differentiation at the species level (Fig. 1A), with 156,274 nucleotide changes between the L. infantum and L. donovani reference genomes: two of these changes corrected in-frame stop codons in L. infantum-specific pseudogenes with high identity to their L. donovani orthologs (LdBPK\_321870 and LdBPK\_332420).

#### Genomic patterns of SNP diversity within L. donovani lines

We generated an average of 66-fold sequence coverage for each of 17 L. donovani lines derived from unique visceral leishmaniasis patients, among whom there were different responses to antimonial therapy (Supplemental Table S3). By mapping the sequencing reads from these lines to the BPK282/0cl4 reference L. donovani genome sequence, we called SNPs using a conservative approach exploiting the read-depth coverage values across all lines to minimize systematic errors ( Jiang et al. 2009; Lynch 2009). This approach identified SNPs at 3549 sites, of which 2933 were in noncoding regions, 220 were synonymous mutations in coding regions, and 396 caused changes at the protein sequence level. As expected, there was evidence of extensive purifying selection at genes: 17.4% of the SNP variation surveyed was in coding regions, which account for 47.0% of the genome. Coding-sequence mutations occurred in just 368 genes—263 had at least one protein-level polymorphism and 158 one or more silent changes. This was confirmed by neutral allele frequency distributions for coding and noncoding sites (Supplemental Fig. S2) and a higher rate of synonymous variants segregating at intermediate allele frequencies relative to nonsynonymous ones (Supplemental Fig. S3).

Despite a low level of genetic differentiation between the lines, principal component analysis (PCA) of genome-wide nucleotide variation (Fig. 1B), and a protein-level phylogenetic network (Fig. 1C; Supplemental Fig. S4) both revealed significant genetic differences in our population not detected by microsatellite profiling (Alam et al. 2009; Bhattarai et al. 2010). These



Figure 1. The phylogenomic context of functional variation in clinical L. donovani lines. (A) A neighbor-joining phylogenomic tree of Leishmania species. The relative similarity is shown (1% was equivalent to 108,000 mutations). The first column indicates the fraction of the known genomes orthologously aligned to L. donovani and the second is the number of SNPs identified (Table 2). (B) Principle component analysis (PCA) of genomic SNP variation in the 17 L. donovani lines resistant (red) and susceptible (blue) to SGG. The two most significant PCs distinguished three main groups, accounting for 63.3% of the total variation. The PCA L. donovani line numbers correspond to those shown in C, a median-joining phylogenetic network of genome-wide nonsynonymous sites variation (396 SNPs) for samples resistant (red) and susceptible (blue) to SSG from India (beginning with BHU) and Nepal (BPK). The branch lengths displayed are proportional to the number of differences between lines. The position of the ancestral node for L. infantum (black) was shortened: For comparison, the L. donovani:L. infantum branch length was 138 times that between the most divergent L. donovani (1, BHU568/0cl1; and 10, BPK035/0cl1).

distinct relationships resolved by genomic SNP data were closely mirrored by phylogenetic signals inferred from large CNVs (Supplemental Fig. S5), and supported the possibility of multiple events of emergence of SSG resistance (Laurent et al. 2007). Although geographic separation has played a significant role in genetic differentiation between species (Lukes et al. 2007), no evidence for this was found in the 17 lines, presumably due to the small geographic area sampled and extensive local human migration (Rijal et al. 2010). Similarly, little of the variability in SSG phenotype could be explained directly by either genome-wide variation or geographic distance.

The sites most differentiated between the SSG-resistant and SSG-susceptible lines across the genome, and so potentially involved in the resistance phenotype, were identified using F-statistics (Wright 1951). We found a total of 41 SNPs with  $F_{ST} > 0.4$ , and these most discriminating SNPs showed an excess of nonsynonymous mutations (Fisher's Exact test  $P < 0.02$ ) (Table 1). No SNP completely discriminated between resistant from sensitive lines, but 34 out of these 41 were present solely and homozygously in four related SSG-resistant lines (BHU568/0cl1, BHU573/0cl1, BPK173/0cl3, and BPK275/0cl18; Supplemental Table S4). These four lines likely share a recent common ancestor, so while our data cannot resolve whether these variants were due to selective events or population history, it is possible that some of these SNPs may be related to SSG resistance in this group of isolates.

Population genomics of Leishmania clinical strains

Identifying recent selective events this parasite population could be hindered by complex population history and modes of reproduction. L. donovani propagation is largely clonal in regions of endemic leishmaniasis, leading to high levels of inbreeding (Gelanew et al. 2010; Rougeron et al. 2010). Together with its likely small effective population size (Laurent et al. 2007), this means purifying selection should be less efficient at removing disadvantageous alleles, obscuring signals of selective pressure (Charlesworth 2009). Thus, the pattern in our sample of low diversity (nucleotide diversity,  $\pi$  = 68.6 per Mb) (Tajima 1983) and an excess of rare alleles ( $F_S$  = -1.72) (Fu 1997) could be due to a pattern of clonal reproduction as well as purifying selection, which had a limited power to remove mildly deleterious variants. Comparing the proportions of nonsynonymous and synonymous mutations in our 17 lines and between the four other Leishmania species (Fig. 2) showed that a substantial proportion (0.55) of the population-level variation was neutral or nearly neutral, confirming that selection was relatively weak within this cohort, though stronger on high-frequency variants (Supplemental Table S5; Supplemental Fig. S6).

#### Detecting ancient and recent adaptive evolution in L. donovani

L. donovani has been a parasite of humans for a long period of time, and so hostspecific selective processes are likely to

have shaped its genome (Stevens et al. 2001; Simpson et al. 2006). Furthermore, genes are likely to show similar adaptive changes in related species (Obbard et al. 2010). Consequently, by examing the effects of long-term adaptation between species as well as recent selective events in our population, novel insights into the functional importance of genes in Leishmania can be revealed.

We used a series of complementary tests to examine variation between five Leishmania genomes in the L. donovani lineage and within our set of 17 L. donovani lines (Supplemental Fig. S7). Twelve genes showed evidence of sustained positive selection across the Leishmania genus, as inferred from a high ratio of nonsynonymous to synonymous subsitutions ( $\omega = d_N/d_S > 1$ ) (Table 2; Supplemental Fig. S8; Yang 2007). These include 10 not previously identified in a similar test comparing L. infantum, L. major, and L. braziliensis (Supplemental Tables S6, S7; Peacock et al. 2007). A L. donovani lineage- and site-specific test of  $\omega$  values highlighted 11 individual sites in nine genes that have historically been under directional selection in L. donovani (Supplemental Table S8; Yang 2007). These two analyses did not make use of the information from our multiple L. donovani lines, so by comparing the relative rates of coding sequence changes within the 17 lines to those between L. donovani and other Leishmania species, an additional 15 genes showing positive selection were identified with the direction of selection test (Supplemental Table S9; Stoletzki and Eyre-Walker



Figure 2. The neutrality of coding-site allele-frequency spectra. The allele-frequency spectrum for SNPs at nonsynonymous (black line) and synonymous (dashed line) sites among the 17 samples for the genome. Allele frequencies were computed using read-depth coverage values and were folded because the selective process may act on both the ancestral alleles inferred from L. infantum as well as the derived version with the L. donovani population. The ratio of nonsynonymous to synonymous SNPs approaches one as the allele frequencies increase, suggesting that higher frequency variants are subject to stronger purifying selection to remove deleterious alleles.

2011). To identify genes with evidence of positive selection that could not be aligned across all five genomes, pairwise comparisons between L. donovani and each of the four other Leishmania species identified 36 genes with consistently high  $D<sub>N</sub>/D<sub>S</sub>$  ratios (Supplemental Table S10). Finally, signatures of selection at genes were explored using a genome-wide sliding-window approach for standard measures of diversity within the 17 lines:  $\pi$ ,  $\theta_{\rm W}$ , (Supplemental Fig. S9; Watterson 1975), and Tajima's D (Supplemental Table S11; Tajima 1989).

Many of the genes identified by these approaches encode hypothetical proteins, but a number of results stand out as being explainable in terms of known gene functions important to Leishmania biology. Molecular studies investigating antimonial resistance in L. donovani clinical isolates have implicated modifications to proteins topologically predisposed to faster adaptation (Kim et al. 2007; Sackton et al. 2007; Cui et al. 2009) such as surface proteins (Samant et al. 2007) and transporters (Mandal et al. 2010) in the SSGresistance phenotype. Here, we provide evidence of ancient and recent adaptive evolution both between Leishmania species and in the L. donovani lineage at the highly immunogenic amastin surface glycoproteins (Wu et al. 2000; Stober et al. 2006; Jackson 2010). Diversity at these loci should be advantageous within our set of L. donovani lines, and, indeed, we detected an excess of derived high-frequency SNPs at one amastin locus, with half of the

12 protein-level SNPs in the 34D subfamily amastin gene (LdBPK\_341150) segregating at elevated frequencies (Supplemental Table S12).

Evidence of adaptive evolution was also consistently observed in genes encoding surface proteins with roles in transport, including some that have roles in SSG resistance. A high level of diversity was found at an amino acid transporter locus (LdBPK\_310350,  $\pi$  = 0.9 per kb) that has been found to be downregulated in SSG-resistant L. donovani strains (Singh et al. 2010). Several genes previously associated with drug resistance showed signs of persistent positive selection in Leishmania, including

$F_{ST}$	$C^a$	<b>Position</b>	$S^{\rm b}$	R <sup>c</sup>	Type <sup>d</sup>	Gene product	Site	Gene ID
0.54	34	1046281 <sup>e</sup>	0.81	0.00	N	Conserved hypothetical protein	H <sub>523R</sub> <sup>t</sup>	LdBPK 342390
0.44	2	36464	1.00	0.43	N	Phosphatidylinositol 3-kinase	R3452H	LdBPK 020100
0.44	4	3377299	1.00	0.43	N	Rhomboid-like serine protease	A113V	LdBPK 040850
0.44		383016	1.00	0.43	Syn	Phosphoacetylglucosamine mutase	161V	LdBPK 070930
0.44	12	128965	1.00	0.43	N	Conserved hypothetical protein	Y1230C	LdBPK 120270
0.44	16	690776	1.00	0.43	N	Conserved hypothetical protein	Y1214C	LdBPK 161760
0.44	19	412141	1.00	0.43	Syn	4-coumarate CoA ligase	395V	LdBPK 190970
0.44	21	412303	1.00	0.43	Syn	Hypothetical protein	251P	LdBPK 211240
0.44	24	26882	1.00	0.43	N	Ankyrin/TPR repeat protein	A150V	LdBPK 240130
0.44	25	702972 <sup>9</sup>	1.00	0.43	N	Conserved hypothetical protein	A61E	LdBPK 251890
0.44	31	553554 <sup>9</sup>	1.00	0.43	Syn	Conserved hypothetical protein <sup>h</sup>	426T	LdBPK 311340
0.44	31	555080	1.00	0.43	N	Conserved hypothetical protein	S268P	LdBPK 311340
0.44	32	3570219	1.00	0.43	N	Conserved hypothetical protein	V125L	LdBPK 320990
0.44	35	1773762 <sup>9</sup>	1.00	0.43	N	Conserved hypothetical protein	A54T	LdBPK 354470
0.44	36	886126 <sup>9</sup>	1.00	0.43	Syn	Conserved hypothetical protein	347T	LdBPK 362330
0.42	33	$1316522^e$	0.20	0.86	N	Conserved hypothetical protein	A390V	LdBPK 333140
0.40	34	$493541^e$	0.78	0.14	Syn	Amastin-like surface protein	209A	LdBPK 341150

Table 1. Coding SNPs showing greatest differentiation between lines resistant and susceptible to SSG treatment

SNPs were ranked by  $F_{ST}$ : This set of 17 all had  $F_{ST} > 0.4$  (bootstrapping  $P < 0.02$ ) and were in coding sequence; noncoding SNPs with  $F_{ST} > 0.4$  are in Supplemental Table S4.

a Chromosome.

<sup>b</sup>Frequency of ancestral allele in SSG-sensitive set.

c Frequency in SSG-resistant set.

<sup>d</sup>N stands for nonsynonmous and Syn for synonymous.

e Sites not among the 34 SNPs, where the derived allele was homozygous in SSG-resistant lines BHU568/0cl1, BHU573/0cl1, BPK173/0cl3, and BPK275/ 0cl18, and was not in any other lines.

f Predicted to be tolerated by protein impact software.

g SNPs confirmed by allele-specific genotyping.

<sup>h</sup>Contained two high-F<sub>ST</sub> SNPs; locus had a positive direction of selection test value (Supplemental Table S9); predicted to have phosphatase 2C activity (InterProScan IPR001932).

#### Population genomics of Leishmania clinical strains



Table 2. Substitutions in Leishmania genomes compared twith the L. donovani genome

<sup>a</sup>Nucleotide diversity per Mb.

 $^{b}$ Compared with the *L. donovani* reference genome.  $D_{N}$  is the number of nonsynonymous changes between L. donovani and the given species, and  $D_s$  the synonymous mutations.  $p_N$  is the number of nonsynonymous variants segregating in the 17 lines, and  $p<sub>s</sub>$  the synonymous ones. FI is the fixation index. Intraspecific measures of variability for the 17 L. donovani lines are shown for comparison.

ATP-binding cassette elements (Castanys-Muñoz et al. 2008; Leprohon et al. 2009b), histone genes (Singh et al. 2007), and the nucleoside transporter 1 gene (LdBPK\_151230) (Vasudevan et al. 2001).

The A2 protein plays a role in promastigote–amastigote differentiation (Alcolea et al. 2010) and is expressed solely during amastigote-stage host infection in L. donovani (Ghedin et al. 1998; Zhang and Matlashewski 2001) but not L. major, and has been associated with the differing disease tropisms between the two species (Zhang et al. 2003). In contrast to the conserved A2 locus in L. major (Garin et al. 2005), functional CNVs have been previously observed in the L. donovani species complex, and we see significant sequence diversity and structural variation at this region even between our related lines. Whereas 3' and 5' A2-related genes possessed nine high-frequency protein-level SNPs, genes on the rest of that chromosome had only a total of four, suggesting a possible role for variability at this locus in A2 gene expression (Zhang et al. 2003).

Kinetoplastids use the thiol trypanothione and a redox intermediate, tryparedoxin, to defend against oxidative stress: genes involved in this pathway are implicated in resistance to antimonial drugs and in mediating host immune response. Tryparedoxin peroxidase diminishes the inhibition of thiol redox metabolism by antimonial drugs by reactive oxygen species reduction (Wyllie et al. 2004, 2008; König and Fairlamb 2007; Mandal et al. 2007), and is overexpressed in SSG-resistant clinical L. donovani (Wyllie et al. 2010). The tryparedoxin locus itself may be associated with both host immunogenicity and drug resistance in Leishmania (Stober et al. 2005), and in particular, with the murine B-cell response against L. infantum (Castro et al. 2004; Cabral et al. 2008). We discovered variation at three genes associated with redox metabolism: the tryparedoxin peroxidase gene (LdBPK\_ 151140) showed signatures of selection on the L. donovani lineage (Supplemental Table S9) and also had a pattern of balanced variation in the 17 lines. One tryparedoxin gene (LdBPK\_ 291220) had a protein-coding variant in a region of low diversity. In addition, a cAMP-specific phosphodiesterase locus (LdBPK\_151540) displayed evidence of adaptive evolution (Supplemental Table S9): Reduced cAMP phosphodiesterase expression is associated with increased resistance to antioxidant stress, possibly mediated by components of thiol metabolism pathways in L. donovani (Bhattacharya et al. 2009).

#### Whole-chromosome copy-number variation

We used alignments of Illumina reads against the reference L. donovani sequence to assess chromosomal copy number. Using normalized read-depth (s, see Methods), 70.9% of chromosomes had a relative coverage equivalent to one, but a significant proportion of chromosomes deviated from this value by discrete multiples, namely, 1.5- (24.3%), 2- (4.6%), and 2.5-fold (0.2%) (Fig. 3). As validation, we quantified four single-copy genes from chromosomes 17, 34, 36 (mean  $s = 1$  in all lines), and 31 (mean  $s = 2$ ) by qPCR across the 17 lines. The amplification signal from genes on chromosome 31 was 2.2-fold greater than those on chromosomes 17, 34, and 36, confirming the double copy number of chromosome 31 (Mann-Whitney U,  $P$  <

0.001) (Mann and Whitney 1947). We then examined the read ratios that support allele calls, to establish whether the baseline coverage  $(s = 1)$  could be explained by monosomy (in which case,  $s = 1.5$  and  $s = 2.5$  would correspond to mixed populations) or disomy (in which case,  $s = 1.5$  and  $s = 2.5$  would correspond to trisomy and pentasomy, respectively). Considering that the lines here analyzed were cloned, monosomic chromosomes could be expected to be essentially homozygous at sequence level. This was not the case, as an average of 293 heterozygous SNPs were detected per strain on the nine chromosomes showing  $s = 1$ . Accordingly, we concluded that the latter chromosomes were disomic.

Fluorescent in situ hybridization (FISH) has been used to characterize variable aneuploidy for seven chromosomes from individual L. major parasites (Sterkers et al. 2010). Our sequencing approach complements and extends the observation and provided a quantification of chromosomal copy number, for all chromosomes, across a population of cells. Further analysis revealed three main categories of chromosomes: nine chromosomes (17, 18, 19, 21, 25, 28, 30, 34, 36) with disomy in all lines; chromosome 31 alone was tetrasomic in all 17 (Supplemental Fig. S10), and the 26 remaining chromosomes showed variable polysomy values between lines (Fig. 3). As a consequence of this polysomic diversity, the pattern of aneuploidy was unique for each line. Although experimentally induced SSG-resistant L. infantum strains showing aneuploidy have been associated with the drug-resistance phenotype (Leprohon et al. 2009a), no clear link was observed here: average s values of each individual chromosome in the SSG-resistant and SSG-susceptible strains were not significantly different (Supplemental Table S14). An ongoing investigation into genome stability in BPK282/0cl4 revealed that aneuploidy was stable for at least 32 passages after genome sequencing, though we cannot exclude changes between the time of isolation and the 30 passages prior to genome sequencing.

#### Structural variation in L. donovani

Within each chromosome, we used read-depth variation to identify loci with repeated genes (see Supplemental Table S15 for BPK282/0cl4) and to assess copy-number variation (CNV) in the 17 strains. Evidence of large duplications and deletions were discovered

Frequency  $0.4$  $\tilde{C}$ 



**Figure 3.** Aneuploidy in natural populations of  $L$ . donovani. The heatmap shows the copy-number status of the 36 chromosomes for the 17 lines as disomic (1, blue), trisomic (1.5, green), tetrasomic (2, yellow), and pentasomic (2.5, ivory). The color key shows the normalized chromosome read-depth and the distribution frequency.

(Supplemental Figs. S11–S14) as well as clustered single-copy genes flanked by either short direct repeats, ribosomal mobile elements (RIMES), or both. A subset of these protein-encoding genes, in addition to both the mini-exon and rDNA loci, significantly discriminated SSG-resistant from SSG-susceptible lines (Table 3).

Two tandem repeats were analyzed in detail: rDNA transcription units (chromosome 27) and mini-exon genes (chromosome 2). Copy number per chromosome ranged from six to 15 (mean  $10.2 \pm 3.4$ ) for the rDNA genes, and from 26 to 146 (88  $\pm$  28) for the mini-exon genes, consistent with reported values (Kebede et al. 1999; Inga et al. 1998). Gene dosage per cell was estimated taking into account the somy (copy number) values of the respective chromosomes. SSG-resistant parasites showed on average 44% fewer rDNA transcription units/ cell than the sensitive ones (MWU  $P =$ 0.046), and 77% more mini-exon genes (MWU  $P = 0.004$ ). Consequently, the ratio of mini-exon to rDNA genes tended to be higher in SSG-resistant lines (MWU  $P =$ 0.006). In addition, the SSG resistance locus (LdBPK\_310950) was present in more copies in SSG-resistant lines than in susceptible ones (24 vs. 20, MWU  $P = 0.046$ ). This reflects a pattern previously observed in L. tarentolae, where the ortholog of LdBPK\_310950 was more highly expressed in samples selected for SSG resistance than in susceptible ones (Haimeur and Ouellette 1998).

Genome segments flanked by repeats can form extrachromosomal circular episomes through homologous re-

combination between regions adjacent to the repeats (Leprohon et al. 2009a). Here we observed two such regions: a 13.5-kb region on chromosome 23 encompassing four genes (the H-locus, including the ABC-thiol transporter MRPA gene) (Grondin et al. 1996), and a 15.8-kb segment on chromosome 36 containing four





Regions with a differential copy-number between antimony-resistant (SSG-R) and antimony-sensitive (SSG-S) lines (MWU, P < 0.05; Supplemental Table S14). Copy number of the respective loci or genes is shown as median per set. All are repetitive genes (GeneDB, www.genedb.org) except a candidate episome region referred to here as the MAPK-locus (mitogen-activated protein kinase) was flanked by short repeats and/or ribosomal mobile elements (RIMEs) containing a CNV encompassing five genes.

alnvolved in mRNA splicing.

<sup>b</sup>Implicated in parasite virulence (see Matlashewski 2001).

c Functions in RNA translation.

dOverexpressed in antimonial-resistant L. tarentolae (Haimeur and Ouellette 1998).<br>EMitogen-activated protein kinase: associated with survival in macrophage (Saha et

<sup>e</sup>Mitogen-activated protein kinase; associated with survival in macrophage (Saha et al. 1985).

f Linked to SSG-resistance (Singh et al. 2007).

<sup>g</sup>A gene encoding a ubiquitin fusion degradation protein (LdBPK\_366780) is at the 3' end of the region.

was due to the presence of episomal DNA by using an assay combining alkaline lysis (to extract circular DNA) and PCR amplification with primers situated at the edges of the chromosomal locus and oriented externally (Fig. 4). With this design, PCR amplification should be only possible when episomes are present, and assuming that circularization would occur through homologous recombination between the 822-bp region shared by two acid phosphatase genes located at both edges of the locus (LdBPK\_366740 and LdBPK\_366770), an amplicon of 1700 bp would be expected. We observed amplicons of that size (Supplemental Fig. S15) and the nucleotide-level sequence of the amplicon further verified this assay. Gene dosage per cell showed that there were more copies of the MAPK-locus in SSG-resistant than MAPK-sensitive lines (median 31 vs. 23, MWU  $P < 0.05$ ) (Table 3). In contrast, no significant differences were observed between SSG-resistant and SSG-sensitive lines for the H-locus (median 8 vs. 7; Supplemental Table S14). The ongoing genome stability study above revealed that the read-depth of the MAPK-locus was stable from the initial sequencing time point to passage number 32, though again, we cannot exclude that changes might have occurred since the parasite was originally isolated.

We analyzed the influence of somy variation on gene transcription by comparing the coverage of cDNA and genomic DNA reads mapped to the reference strain BPK282/0cl4: A poor correlation was observed between the genomic and cDNA CDS coverage read-depth ( $r^2$  = 0.29, t-test  $P < 7.75 \times 10^{-4}$ ), but this increased when chromosome 31 was excluded ( $r^2$  = 0.54, *t*-test  $P < 4.75 \times 10^{-7}$ )—the latter tetrasomic chromosome showed a similar cDNA read-depth as



Figure 4. Copy-number variation spanning MAPK-locus on chromosome 36. Copy number per cell in L. donovani (red, SSG-R; blue, SSG-S) was much higher for the MAPK locus than the chromosome 36 median for L. donovani (black dashed line) and L. infantum (black). The amplified region is marked in gray and their white edges indicate the location of two direct repeats. Genes within and adjacent to the amplified region are given in black and light gray, respectively. The MAPK (mitogen-activated protein kinase) gene is labeled as LMPK (LdBPK\_366760). Recombination events may occur through a highly homologous 220-bp region starting at the start codon of the tartrate-sensitive acid phosphatase (LdBPK\_366740) and histidine secretory acid phosphatase (LdBPK\_366770). LdBPK\_366750 encodes a protein of unknown function. Two RIME (L. donovani ribosomal mobile elements; light-blue) flank the duplicated region. Read-depth values were computed using 1-kb sliding windows, and error bars are shown for each kilobase.

the disomic ones. Coverage for individual genes was proportional to the genomic copy number for repetitive genes (Supplemental Table S15), though with some notable exceptions (e.g., alpha tubulin or elongation factor 1-alpha loci), likely reflecting both the increased stability of the corresponding mRNAs at the life stage at which RNA was extracted, and also the complexity of transcription on Leishmania.

# **Discussion**

An ability to underpin large epidemiological studies with genomewide discovery of new variants is critically important. In this study, we demonstrated the feasibility of using deep genome sequencing to first produce a relevant reference genome, and second, to use it to characterize natural variation in clinically isolated Leishmania donovani parasites. Our study focused on the Indian subcontinent, where L. donovani sequence diversity is low and a high sensitivity to detect relevant variants is essential. Within this closely related set of parasites from a single disease focus, whole-genome sequencing resolved the details of population structure not visible using traditional multilocus typing methods (Alam et al. 2009).

We observed a low level of SNP variation between the 17 L. donovani lines sequenced here in comparison to other eukaryotes and Leishmania species (Laurent et al. 2007). An excess of rare nonsynonymous alleles were distributed across the genomes beyond levels predicted by interspecific comparisons, suggesting that a recent population recovery after a sustained bottleneck may explain this pattern of diversity (Nielsen 2001; Hermisson 2009), fitting the epidemiology of VL re-emergence and spreading after DDT spraying campaigns. This pattern may mask signals of adaptive evolution (Elyashiv et al. 2010). Consequently, genotype and phenotype changes in L. donovani should be examined in the context of a dynamic population structure as well as selective processes induced by drug treatment.

In contrast to the limited SNP variation among the 17 lines, extensive variation in chromosomal copy number was discovered. Aneuploidy is known to arise in Leishmania, but for only a small number of chromosomes and under experimental conditions, such as gene knockouts (Cruz et al. 1993) or induced in vitro drug resistance (Ubeda et al. 2008; Leprohon et al. 2009a). Aneuploidy has previously been observed in seven L. major chromosomes from individual parasite cells of a laboratory strain using FISH (Sterkers et al. 2010). In this study we documented the phenomenon for the first time on a genome-wide basis in clinical lines. Our results demonstrated extensive variation in aneuploidy within the 17 lines, implying global differences in gene dosage; however, the absence of a clear relationship with drug resistance contrasts with earlier experimental work (Leprohon et al. 2009a). Although aneuploidy was stable in culture, analysis of ploidy immediately after parasite isolation, or if possible, directly in the patient might yet reveal a correlation with a drug-resistance phenotype. Nonetheless, there was a remarkable disparity between the stable tetrasomy and disomy observed for one and nine chromosomes, respectively, and the highly variable somy of the 26 other chromosomes. Further work is needed to understand the origin of aneuploidy; it could be related to a chromosomal replication defect (Sterkers et al. 2010) or sexual recombination, followed by genome erosion as proposed in Trypanosoma cruzi (Lewis et al. 2009).

Besides aneuploidy, two other features of Leishmania genome plasticity contributed to gene-dosage differences on a finer scale. The first was the expansion and contraction of genes in tandem arrays. These are expressed through polycistronic transcription,

suggesting that the primary purpose of the arrayed structure is to regulate gene dosage. As a result, changes in copy number could contribute directly to variation in expression of antigen-related genes (Victoir and Dujardin 2002). The second feature was an episome that varied in copy number between our lines. Episomes have previously been detected after drug selection in vitro (Leprohon et al. 2009a), but for the first time, we document the amplification of the episomal MAPK locus, containing a MAPK gene (LdBPK\_366760) likely to have a role in signal transduction (Wiese 2007) and an acid phosphatase gene (LdBPK\_366770) that could be expressed during infection (Ellis et al. 1998). In one instance of induced drug resistance, the phenotype and the corresponding episome were unstable in the absence of the drug pressure (Leprohon et al. 2009a). However, resistance to antimonials is stable during in vitro maintenance (Laurent et al. 2007), suggesting that antimonial resistance has a negligible fitness cost (Vanaerschot et al. 2010), which may explain the stability of the MAPK episome in vitro. The biological role of gene dosage caused by this assortment of SVs remains unexplored. In trypanosomatids, gene expression is primarily regulated at the post-transcriptional level rather than at initiation (McDonagh et al. 2000), allowing up-regulation of expression by copy-number amplification (Victoir and Dujardin 2002). We have shown in the reference line that gene dosage strongly correlates with transcription levels, suggesting that there may indeed be functional consequences to this variability requiring exploration at proteome and metabolome levels.

We have also shown the contributing effects of both singlenucleotide and structural polymorphisms to the population genomics of these parasites. For instance, the SSG resistance locus (LdBPK\_310950) had a substantial difference in copy number between the SSG-resistant and SSG-susceptible lines, and had only three distinct haplotypes despite the presence of six high-frequency amino acid substitutions. Moreover, separate genome-wide phylogenetic analyses based on SNPs or CNVs both converged on strikingly similar population structures. Thus, integrative approaches that combine SNP and SV data to maximize the variation that is included are likely to yield the greatest insights into the diversity of parasite biology.

Distinct patterns of diversity were also detected by both SNP and copy-number analyses in genes related to RNA stability and translation. A trend of ancient adaptive evolution was perceptible at six such genes, and extended regions of positive selection within the 17 lines were observed at loci encoding components of ribosomes and RNA-binding proteins (LdBPK\_131120-1280, LdBPK\_352230- 2370). These nucleotide-level signatures of selection were paralleled by significant SV at two loci essential for translation: the rDNA and mini-exon genes. SSG-resistant lines had over twice as many mini-exon genes per rDNA transcription unit compared with SSG-sensitive ones. This intriguing disparity suggests that systemic adaptations, which substantially and globally alter the proteome, have a role in drug resistance—a concept that is supported by a previous metabolomic study, where 100 out of 340 detected metabolites differed in quantity between the drug resistant and sensitive phenotypes (t'Kindt et al. 2010).

In this study we have attempted to link genome-wide variation of L. donovani strains to their differential responses to drug exposure. We found evidence that drug resistance has multiple origins even in closely related lines, mirroring results from other parasites (Hawkins et al. 2008), and the associated differing genomic signatures in our small sample of isolates is compatible with a pleomorphic response. A full understanding of the emergence of drug resistance even in this restricted region will require validation

in more strains. Even then, the genetic switches associated with the phenotype diversity may be specific to this population, so a broader sampling of genetic variation in L. donovani will be needed to comprehensively describe population-level Leishmania variability in a clinical context, particularly given that the substantial genetic divergence between our reference Nepalese L. donovani BPK282/0cl4 and the reference Spanish L. infantum JPCM5 strain suggests a significant regional component to diversity in the L. donovani species complex. Beyond deeper sampling, improved genome assemblies will improve our ability to identify SVs, enhancing combined analyses of SNPs and SVs, including identifying episomes and variable chromosome copy number.

In terms of molecular adaptations of antimonial-resistant parasites, our results support the concept of a systemic and pleomorphic response by L. donovani. On one hand, resistant and sensitive parasites differ by a series of genetic features, some of them being possibly related directly with an adaptation to antimonial pressure (like detoxifying enzymes or pumps), others being connected with housekeeping adaptations (like the hits on translation machinery here evidenced). The concept of a systemic adaptation is supported by metabolomic studies undertaken on strains studied here (t'Kindt et al. 2010). It is likely that there is an evolutionary cascade of adaptations, possibly to compensate the cost of a previous one or to provide a more adequate frame for its expression (for instance through adaptation of the translation machinery). Further work at population and experimental levels is required to elucidate this chain of events, but the power of full genome sequencing and other "omics" is obviously unique to address these questions in a systems biology approach. On the other hand, the emergence of multiple origins of drug resistance in this population together with different genomic signatures encountered among antimonial-resistant parasites is compatible with a pleomorphic response of L. donovani. This is supported by previous studies targeting specific genes and pointing out different patterns of overexpression in antimonial-resistant parasites (Adaui et al. 2011).

This study lays the groundwork for more sensitive and powerful approaches to collating genomic diversity, as well as comprehensively describing population-level Leishmania variability in a clinical context. Within the region L. donovani, infection levels are both endemic and epidemic. Changes in drug policy in the Indian subcontinent (from SSG to miltefosine and probably to combination treatment in the near future) are likely to result in dynamic selective pressures that mould the genome of this parasite (MacLean et al. 2010). Continuous surveillance must be maintained to monitor the threat from the ongoing emergence of drug resistance. The L. donovani reference genome provides a tool to identify and analyze new variants as they emerge. With available second-generation sequencing technologies, the approach of developing a reference and then studying the local population genetics from within any study region, and for any parasite, is now readily possible.

# Methods

#### Sample collection

All 17 L. donovani isolates were obtained from Nepalese and Indian patients with visceral leishmaniasis (Supplemental Table S3; Rijal et al. 2010). Species identity of the 17 lines was confirmed by PCR– RFLP analysis of cysteine proteinase b genes (Quispe-Tintaya et al. 2004), and 16 isolates were cloned by the microdrop method (Van

Meirvenne et al. 1975). The 16 cloned lines and uncloned BPK085/ 0 used in present study are referred to as lines. A line (BPK282/0cl4, also known as BPK282/0 clone 4) was chosen as a biological reference for determination of the L. donovani genome by the Kaladrug-R and Gemini consortia (www.leishrisk.net/kaladrug, www.leishrisk. net/gemini) based on its characteristics of being drug-sensitive, easy to manipulate in vitro, and a representative of the most frequent microsatellite group in the Indian subcontinent (Alam et al. 2009). In addition, it is sensitive to SSG and miltefosine, has good infectivity both in animals in vivo and in macrophages in vitro, and was isolated from a cured patient in the Nepalese endemic area with a documented treatment outcome.

#### Sequencing and assembly of genome sequence data

A reference L. donovani genome sequence for isolate BPK282/0cl4 was produced using 1.29 million single-end and 3.58 million paired-end 454 reads with an average length of 167 bp and a mean insert size of 3 kb, corresponding to 815 Mb of DNA (Supplemental Methods). A total of 96% of the reads were assembled using Newbler (Quinn et al. 2008) into an initial set of reference contigs and scaffolds, with N50 values of 22.3 and 680 kb, respectively.

Three complementary genome assembly tools were used to improve the accuracy of the BPK282/0cl4 contig sequences (Supplemental Fig. S1). First, homopolymer errors induced by the 454 pyrosequencing were corrected by the Illumina reads, which had a median depth of 52-fold for BPK282/0cl4: These shorter 76-base reads had a more uniform genome-wide distribution, and thus fewer homopolymer errors. Miscalled single bases and indels in the 454 contigs were corrected with iCORN (Iterative Correction of Reference Nucleotides) (Otto et al. 2010), run for 14 iterations. Second, the contigs were iteratively extended by locally assembling Illumina data into gaps using IMAGE (Iteratively Mapping and Assembly for Gap Elimination) (Tsai et al. 2010) for 18 iterations. In order to eliminate additional errors introduced by IMAGE, iCORN was repeated for five further iterations. Third, the refined contigs ordered and oriented against the closely related and largely orthologous L. infauntum genome (Peacock et al. 2007) using AB-ACAS (Algorithm Based Automatic Contiguation of Assembled Sequences) (Assefa et al. 2009).

#### Quality control and read mapping of multiple lines

Excluding PCR duplicate reads, 41.0 Gb of sequence was generated for the 17 lines using the Illumina platform: a mean of 31.7 million reads per Illumina run (Supplemental Methods). On average, 27.3 million reads per lane (86.1%) were correctly paired and mapped to chromosomes, and 1.7 million per lane (5.4%) to contigs not assigned to chromosomes or to kDNA (Supplemental Tables S16, S17).

Variability between Illumina sequencing runs made it necessary to develop approaches to ensure that the data analyzed was of high quality (Malhis and Jones 2010). Using the expected GC content distribution from L. infantum (Peacock et al. 2007), the GC distributions for the reads for each line were examined: The median was 0.62 for most data sets, but poor-quality ones had lower values (Supplemental Fig. S16). Empirical examination of the sequence quality parameters and read-depth coverage with Samtools v0.1.6 (Li et al. 2009) showed that the mode and median of basequality score (BQ) and coverage could distinguish informative from substandard sequencing data (Supplemental Fig. S17). The latter had lower median coverage (<17 vs. 41+), coverage mode (<8 vs. 25+), median BQ (<58 vs. 72+), BQ mode (<34 vs. 65+). BQ was the phred-style log-scaled adjusted probability that the given base was incorrect.

Reads for each line were mapped to the reference chromosomes with SSAHA2 (Ning et al. 2001) using the Smith-Waterman algorithm (Smith and Waterman 1981). All nonmapping and artificial duplicate reads were removed, as were sites with less than threefold coverage, or with low BQ (<26) or mapping quality scores (<31). Mapping quality reflected the probability of a given read mapping uniquely to the genome sequence, such that reads derived from DNA repeats with multiple high-orthology hits were excluded.

#### Classifying kinetoplast DNA

Homology between all known minicircle (381) and maxicircle (112) DNA sequences from GenBank (www.ncbi.nlm.nih.gov) and all contigs that could not be assigned to chromosomes was assessed using MegaBLAST (Zhang et al. 2000) for pairs whose E value <0.01 and score >100 to remove short segmental partial hits. The L. infantum and L. major genomes were included to identify contigs that were chromosomal. This assigned 26 contigs (22.0 kbp) to minicircles, two (19.0 kbp) to maxicircles; those that hit one or more of the four categories (L. infantum, L. major, minicircle kDNA, and maxicircle kDNA) were assigned as miscellaneous. The amount of reads mapped to kDNA varied among the samples from  $\sim$ 10%–1% of the total, reflecting the difficulty in quantitatively sequencing kDNA, particularly for minicircles due to their small length.

#### Gene annotation verification

Annotating the L. donovani genome was aided by the shared genomic characteristics of Leishmania species with respect to codon usage bias (Myler et al. 1999), its lack of cis-splicing and conserved synteny (Peacock et al. 2007), as well as the relatively close genetic relationship between L. infantum and L. donovani. L. infantum gene models ( June 2010) were transferred to L. donovani based on sequence conservation and synteny with RATT (Rapid Annotation Transfer Tool) (Otto et al. 2011). The resultant L. donovani gene models were manually inspected and corrected where appropiate using Artemis (Rutherford et al. 2000; Carver et al. 2008) and the Artemis Comparison Tool (Carver et al. 2005). A scan for novel open reading frames (ORFs) longer than 450 bp with distinct patterns of codon usage and sequence similarity with other genes in GenBank did not identify any new gene models.

#### SNP identification and validation

A series of SNP quality validation steps were implemented to exclude sequencing errors and mapping artefacts. Candidate variable sites and indels were initially identified with Samtools from loci having a read-depth of <1000-fold and a maximum of three SNPs in any given seven-base region. Perl scripts were used to select only those candidate SNPs that met the following criteria: (1) the read coverage for the variant base on the forward or reverse strand >3; (2) a high SNP quality (>30); (3) genotypes were known in at least half of the 34 genotypes; (4) at least one read-length (76 bp) distant from contig gaps; and (5) normalized read-depth coverage was within two standard deviations of the chromosome's normalized median value. SNP quality was the average BQ-weighted mapping quality for all reads mapping to the site. If a candidate SNP was heterozygous, the variant BQ was checked to ensure it was not significantly worse than the reference genotype BQ.

In order to identify repetitive, arrayed, and paralogous DNA segments, read-depth coverage was normalized for each chromosome by first measuring the coverage distribution at every position

to which at least one read mapped (thus avoiding bias due to gaps). After excluding sites whose coverage was more than one standard deviation from the initial chromosome median, an optimized chromosome median and standard deviation were determined for interchromosomal comparisons of coverage, so that chromosomes whose coverage was consistently higher or lower than other chromosomes could be highlighted.

To counter elevated false-positive detection rates in repetitive and paralogous regions, the average local uniqueness was determined using a sliding window approach. Up- and downstream from each site (on both strands), the minimum average point at which a local region became unique (k bases) was evaluated. A total of 97.9% of regions not containing gaps were unique for  $k < 30$ (Supplemental Fig. S18), and for this threshold  $(k < 30)$  the relative rates of singleton discovery in screened (30%) and unscreened (45%) SNP sets were stable (Supplemental Fig. S19). All sites were unique for  $k > 675$ , indicating that this was the maximum repeat size in this version of the *L. donovani* genome.

In order to examine the validity of SNPs in both polymorphic and paralogous regions, candidate SNPs were examined using PCR of four amplicons (Supplemental Table S18) and with SNP genotyping. The SNP genotyping assayed 289 possible SNPs as representatives of an initial set of 7642 variants in the 17 strains and was conducted in duplicate using mass spectrophotometry of allelespecific amplified DNA on the Sequenom platform (Buetow et al. 2001).

Population-wide allele frequencies were estimated using readdepth coverage values for each of the 17 lines pooled together, in order to minimize epistatic biases associated with next generation sequencing strategies ( Jiang et al. 2009; Lynch 2009). A scale of SNP likelihood was used for interpreting the SNP genotyping results using the aligned L. infantum genome to determine the derived allele for each of the 289 genotyped sites (Supplemental Fig. S20). This approach was used to calculate the derived and folded allele frequencies for the 3549 validated SNPs for the 17 lines.

#### Structural variation discovery

In devising the CNV detection criteria, we aimed to develop sensitive methodology to identify real biological signals of CNVs in the context of stochastic variability of read coverage and misassembly (Lander and Waterman 1988). Median normalized readdepth was measured at bases located within one standard deviation of the initial chromosomal median to remove outliers caused by assembly gaps, spurious high-coverage regions, and CNVs. Normalized read-depth per haploid genome (d) was defined as a raw depth  $(d_r)$ , divided by the median depth of its chromosome  $(d_{ch})$ : so that  $d = d_r/d_{ch}$ .

To get chromosomal read-depths, the sequence data for each sample was normalized using the median depth of 36 chromosomes of a line  $(\rm{d}_{\rm{mch}})$  to make comparisons between samples, and the normalized median depths of disomic, trisomic, tetrasomic, and pentasomic chromosomes become  $\sim$ 1.0, 1.5, 2.0, and 2.5, respectively. So for a normalized chromosome read-depth or somy value,  $s = (d_{ch}/d_{mch})$  a read-depth per cell  $(d_{pc})$  was defined as  $d_{pc} =$  $2ds = 2d[d_{ch}/d_{mch}] = 2[d_r/d_{mch}]$ , thus reflecting differences in somy number.

The detection of structural diversity was based on the assumption that all genomic regions have equal probabilities of being sequenced by any read, such that coverage was a Poisson-distributed variable approaching a normal distribution as coverage increases based on the central limit theory (Sebat 2007). Consequently, SVs were detected with the read-depth coverage distribution, and read-pair insert size distributions, microhomologies (Hastings et al. 2009), and the densities of singleton reads whose mate pair was unmapped were used to confirm or reject candidate SVs.

In order to increase the specificity of SV analysis, candidates were excluded if they met any of the following criteria: (1) their length <1 kb or their normalized read-depth coverage was not within two standard deviations of the normalized median for the chromosome; (2) they were at chromosome ends; (3) they had a pattern of uniform heterozygosity in the 17 lines; (4) they were in missing paralogous regions in comparison with L. infantum; or (5) they were located in a region with low uniqueness (Supplemental Fig. S18). In addition, SVs found in samples with high read-depth variation (BPK043/0cl2, BPK067/0cl2, and BPK298/0cl8) were not considered unless they were longer than 3 kb. L. donovani candidate regions were compared against L. infantum chromosomes using BLAST (Altschul et al. 1990) and visualized in ACT (Artemis Comparison Tool) (Carver et al. 2008). The depth coverage of L. infantum reads mapped against BPK282/0cl4 also identified false candidate SVs that were present in L. infantum. Small-scale SVs were assessed using d to avoid calling SVs due to somy differences.

To determine genetic distances in the 17 lines to construct a neighbor-joining tree, effective normalized copy numbers were estimated for each CNV from the normalized coverage levels. These copy numbers were adjusted for effective normalized read-depths  $(d_{n2})$  relative to the minimum  $(min_d)$  and maximum  $(max_d)$  values in the set of samples, such that  $d_{n2} = (d - \text{min}_d)/(\text{max}_d - \text{min}_d)$  in order to assess CNV variation in a quantitative manner. This approach precluded CNVs with extreme copy-number values from skewing the analysis.

#### Experimental validation of the candidate episome

In order to prepare extrachromosomal circular DNA, an estimated 107 promastigotes of L. donovani line BPK275/0cl18 were selectively denaturated by alkaline lysis (Sen et al. 1992). In order to verify that extrachromosomal circular DNA contained amplicons generated by circularization of the MAPK locus, externally oriented primers homologous to the locus edges (TCTTGGCACGGCATC AGCAG and CATGGCGCAGTGACCTTCAG) were used for 40 PCR amplification cycles (Supplemental Methods). The nucletoide sequence of the amplified sequences was determined with an ABI 3730 automated sequencer (PerkinElmer).

#### Comparing the L. donovani genome to orthologous Leishmania sequences

In order to compare orthologous sites between Leishmania species, a series of tools were used to first identify conserved sequences; second, expand the orthologous regions between genomes; and third, align the orthologous pair (Nygaard et al. 2010). The initial identification of conserved regions was conducted with Genscan (Burge and Karlin 1997) to find genes to serve as syntenic anchors for BLAT comparisons conducted in protein space (Kent 2002), which were subsequently computed by Mercator (Dewey 2007). Mercator iteratively expanded the local pairwise homologous regions across the chromosomes to produce maps of syntenic regions relative to reference L. donovani BPK282/0cl4 (L. infantum: 87 syntenic regions; L. major: 102; L. mexicana: 95; L. braziliensis: 237). Alignment data produced by Mercator were combined with a phylogenetic tree of the species-informed base-level alignments of the orthologous regions (Mavid) (Bray and Pachter 2004). FSA (Fast Statistical Alignment) (Bradley et al. 2009) estimated the local level of homology of these synteny block alignments using MUMmer v3.0 (Kurtz et al. 2004), and inserted gaps where ambiguities arose to ensure that any predictions of orthology made were conservative.

#### Population genomics of Leishmania clinical strains

Substitutions at nonsynonymous, synonymous, and intergenic sites were determined, as were the derived alleles in the 17 L. donovani lines and levels of divergence between species. To obtain a comparative measure of variation between Leishmania species, a neighbor-joining phylogenetic tree was constructed for all genomic orthologous sites with Treepuzzle v5.2 (Schmidt et al. 2002). Genomic scans for highly divergent regions between species indicated faster rates of ancestral change—these can be symptomatic of recent selective sweeps (Nielsen 2001).

The pairwise ratio  $d_N/d_S$  ( $\omega$ ) was calculated for each CDS alignment using the codeml implementation of the PAML 4.4 package (Yang 1997, 2007), where  $d_N$  was the number of nonsynonymous mutations per nonsynonymous site, and  $d<sub>S</sub>$  the equivalent for synonymous sites. If synonymous and nonsynonymous mutations were neutral, it was expected that  $\omega = d_N/d_S = 1$  (Yang 2002). Departures from this, where  $\omega > 1$  ( $d_N > d_S$ ), suggested that nonsynonymous mutations could be advantageous and were maintained under directional selection. If  $\omega < 1$  ( $d_N < d_S$ ), then purifying selection may have eliminated deleterious nonsynonymous variants (Yang 2002). One-ratio models estimated  $\omega$ across the Leishmania lineage for each gene and this was compared with models with  $\omega$  fixed as 1 using likelihood ratio tests (LRTs; Supplemental Methods). In addition, LRTs between variable- $\omega$  and fixed- $\omega$  branch-site models were conducted to find specific sites under selection in the L. donovani lineage (Nielsen and Yang 1998). These tests were complementary to branch-specific approaches published for L. infantum, major, and braziliensis (Peacock et al. 2007).

#### Population diversity and structure analysis

Several complementary approaches were used to investigate the genetic structure releveant to the clinical characteristics of the lines. Median-joining networks of SNPs segregating at nonsynonymous and synonymous sites were constructed using Network v4.2.0.1, excluding noninformative uniformly heterozygous sites (Bandelt et al. 1999, www.fluxus-technology.com). Genetic differentiation between SSG-resistant and SSG-susceptible groups was assessed using  $F_{ST}$  (Wright 1951) based on the relative nucleotide diversity ( $\pi$ ) (Tajima 1983): sites with  $F_{ST} > 0.4$  (1.2%) had gene-flow estimates 16 times lower than those with  $F_{ST} = 0.05$ (Holsinger and Weir 2009). Possible associations between genomic  $F_{ST}$  values, geographic great circle distance, and SSG phenotypes for each pair of lines were also explored using Mantel-test approach (Mantel 1967).

As a result of the low SNP-level diversity and the unique nature of genome-wide haplotypes, allele frequency-based tests were more instructive than haplotype-focused ones. To reflect the lack of linkage information between genotypes, population metrics were determined for each SNP as paired rather than individual genotypes to avoid artifically constructing a balanced pattern of diversity. These summary statistics included Watterson's  $\theta_{\rm W}$ ,  $\pi$ , Fu's FS, and Tajima's D (Tajima 1989); the latter reflected the standardized sample size-corrected difference between  $\theta_W$  and  $\pi$ , and should be minimal under neutrality. Sample sizes were corrected for unknown genotypes at each SNP site. In order to distinguish regions with differential diversity signals due to recent demographic history, only extended regions were considered in a sliding-window scan of intraspecific values of  $\theta_{\text{W}}$ ,  $\pi$ , and D.

The population-level spectrum of evolutionary change was calculated for each gene as  $p_N/p_S$ , the ratio of nonsynonymous  $(p_N)$ to synonymous mutations  $(p<sub>S</sub>)$ . Adjusting this ratio for  $L<sub>N</sub>$  (the number of nonsynonymous sites) and  $L_S$  (synonymous), estimated using KaKs\_Calculator (v1.2) (Zhang et al. 2006), gives the fraction of neutral alleles segregating:  $f = [p_N/p_S]/[L_N/L_S]$ , assuming little temporal variation of selection (Smith and Eyre-Walker 2002). Using  $p_N/p_S$  values for each gene and the ratio of fixed nonsynonymous  $(D_N)$  and synonymous  $(D_S)$  substitutions measured between the orthologous alignments of the L. donovani and each of the other Leishmania genomes, a series of McDonald–Kreitmanbased tests were implemented (McDonald and Kreitman 1991) for a fixation index,  $FI = [D_N/D_S]/[p_N/p_S]$ . Because nonsynonymous and synonymous sites were intercalated in coding sequences and so closely share genealogical histories, the absolute numbers of polymorphisms were examined rather than the rates alone, a viable approach to investigating diversity in structurally variable genes of indeterminant lengths (Nei et al. 2010). If  $FI > 1$ , it indicated an elevated ancestral fixation rate of protein-level changes in L. donovani (McDonald and Kreitman 1991). If FI < 1 with a high  $p_N/p_S$ , this was likely to reflect relaxed selective constraint within the population; or if  $D_N/D_S$  was low, ancestral purifying selection (Eyre-Walker 2002). The expected contingency table values of  $D_{\text{N}}$ ,  $D_{\rm S}$ ,  $p_{\rm N}$ , and  $p_{\rm S}$  for each gene were determined and summed to calculate an expected fixation index (eFI) (Gojobori et al. 2007). The difference between FI and eFI,  $\alpha$  = FI/eFI-1, was calculated to evaluate the genomic scale of the abundance of adaptive and deleterious alleles segregating in the population (Axelsson and Ellegren 2009).

To combat the challenge of searching for evidence of selective processes in a data set with limited rates of intraspecific polymorphism, the direction of selection (DoS) test was conducted as  $DoS = D<sub>N</sub>/[D<sub>N</sub> + D<sub>S</sub>] - p<sub>N</sub>/[p<sub>N</sub> + p<sub>S</sub>]$  (Stoletzki and Eyre-Walker 2011) for genes with  $p_N > 0$ : This also had the advantage of being less prone to biases from purifying selection. In addition, genes likely to possess a high fraction of adaptive variants were further identified by determining  $\alpha = 1 - 1/FI$  (Smith and Eyre-Walker 2002).

Sites variable between species were determined as fixed if they were conserved in the L. donovani population: As a consequence,  $D<sub>N</sub>/D<sub>S</sub>$  values calculated for less-divergent species (such as L. infantum) may be biased by ancestral polymorphisms (Charlesworth 2009; Peterson and Masel 2009), and equally, saturation limitations increase for highly divergent species. Moreover, using counts rather than relative rates ( $D_N$  vs.  $d_N$ ) of the numbers and types of mutations at structurally variable genes may be a viable compromise to omitting such loci.

#### Data access

The annotated reference L. donovani genome for BPK282/0cl4 is available at the EMBL Nucleotide Sequence Database (http:// www.ebi.ac.uk/embl) (accession nos. FR799588–FR799623) and from GeneDB (http://www.genedb.org/Homepage/Ldonovani\_ BPK282A1) and the strain-specific genotypes are browsable via MapSeq (http://www.genedb.org/mapseq/Ldonovani).

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Authors' contributions: C.H.F., G.H.C., G.S., H.I., J.C.D., M.B., S.D., and T.D. designed the study. I.M., S.D.D., S.D., S.R., and S.S. collected, documented, and maintained samples. M.A.Q. and M.S. conducted sequencing. M.V., O.S., and S.D.D. completed PCR assays. J.D.H. and J.C.M. carried out SNP validation. H.I. carried out assembly and mapping. H.I. and T.D. screened se-

quence data. T.D. aligned species' genomes. H.I., J.C.D., T.G.C., and T.D. performed analyses. H.I., J.A.C., J.C.D., M.B., and T.D. wrote the manuscript.

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Tim Downing, Hideo Imamura, Saskia Decuypere, et al.

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