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CHAPTER SEVEN

## Modelling the Effects of Mass Drug Administration on the Molecular Epidemiology of Schistosomes

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#### Abstract

As national governments scale up mass drug administration (MDA) programs aimed to combat neglected tropical diseases (NTDs), novel selection pressures on these parasites increase. To understand how parasite populations are affected by MDA and how to maximize the success of control programmes, it is imperative for epidemiological,

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molecular and mathematical modelling approaches to be combined. Modelling of parasite population genetic and genomic structure, particularly of the NTDs, has been limited through the availability of only a few molecular markers to date. The landscape of infectious disease research is being dramatically reshaped by next-generation sequencing technologies and our understanding of how repeated selective pressures are shaping parasite populations is radically altering. Genomics can provide high-resolution data on parasite population structure, and identify how loci may contribute to key phenotypes such as virulence and/or drug resistance. We discuss the incorporation of genetic and genomic data, focussing on the recently sequenced Schistosoma spp., into novel mathematical transmission models to inform our understanding of the impact of MDA and other control methods. We summarize what is known to date, the models that exist and how population genetics has given us an understanding of the effects of MDA on the parasites. We consider how genetic and genomic data have the potential to shape future research, highlighting key areas where data are lacking, and how future molecular epidemiology knowledge can aid understanding of transmission dynamics and the effects of MDA, ultimately informing public health policy makers of the best interventions for NTDs.

### **1. INTRODUCTION**

Mass drug administration (MDA) is the recommended strategy of the World Health Organization (WHO) to control or, in certain cases, eliminate a subgroup of neglected tropical diseases (NTDs) based on the annual distribution of inexpensive and/or donated drugs (Lammie et al., 2006; Webster et al., 2014). Through MDA, intensive and prolonged selective pressures are, and will be, placed on these parasites, which may have implications for the long-term success of campaigns (Webster et al., 2008, 2014). Policies to optimize success become crucial as programmes in selected countries shift from morbidity control toward elimination as a public health burden (WHO, 2012).

Mathematical models have the potential to explore a number of epidemiological features of both interest and importance in parasite populations (Levin et al., 1997; Levin, 1992; Anderson and May, 1991). Mathematical models can provide profound logistical, financial, temporal and biological benefits through, for instance, testing potential disease control strategies prior to final design and implementation (Rivers et al., 2014) or improving current control methods (Turner et al., 2014; Luz et al., 2011). However, valuable models require accurate parameterizations and a reliable understanding of the disease dynamics under investigation and how these can, and do, respond to differential selection pressures. Unfortunately, to date, few strong predictive mathematical models exist for the majority of

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metazoan parasites under MDA pressure. This is linked to a wider neglect in the study of helminth biology and genetics (Prugnolle et al., 2005a) in comparison to protozoan and bacterial agents such as malaria and tuberculosis (Hotez and Pecoul, 2010). In the case of several of the NTDs, the extent to which mathematical models may be developed and influence public health policy is limited by this absence of biological data on parasite population structure and genetic diversity. Substantial progress is occurring particularly with the recent establishment of the NTD modelling consortium (NTD\_Modelling\_Consortium). However, what remains to be addressed are the key data that these models require, particularly on the complex transmission dynamics of these often multi-host diseases.

The landscape of infectious disease biology is being radically restructured through the advancement of population genetic techniques, the development of next-generation sequencing (NGS) and the abundance of data generated from whole genome sequencing (WGS) (Luikart et al., 2003; Oleksyk et al., 2010; Vitti et al., 2013). Through applying NGS technology to parasite population studies, well-designed research can reap the benefits of sequence data, such as locating regions of the genome under selection (Valentim et al., 2013), and understanding levels and directions of gene flow and infections within and between subpopulations (Kao et al., 2014). Such information will boost our capacity to model and predict the effects of MDA on disease transmission dynamics and selection and how best to maximize control success (Kim et al., 2014).

Within infectious disease epidemiology, bacteriology has been one of the disciplines to benefit earliest from the genomic revolution due to the low cost of sequencing smaller bacterial genomes. Recent work on drugresistant Mycobacterium tuberculosis, for instance, has used large datasets to identify key targets of selection (Farhat et al., 2013; Zhang et al., 2013), to show how antibiotic resistance spreads at different spatial scales (Harris et al., 2010), and quantifying how often resistant clones spread between animal and human populations (Mather et al., 2013). Applying WGS to eukaryotic parasites is complicated by the increased size and complexity of genomes. Population genomics approaches in protozoans such as Plasmodium falciparum (Cheeseman et al., 2012; Takala-Harrison et al., 2013) and Leishmania donovani (Downing et al., 2011), have been driven by the need to identify the locus or loci responsible for drug resistance (Bright and Winzeler, 2013). Within parasitology, malaria research has paved the way in WGS and NGS (Volkman et al., 2012) since the P. falciparum genome was published over a decade ago (Gardner et al., 2002). For example,

a major locus responsible for artemisinin resistance in *P. falciparum* was identified using WGS of both a laboratory-induced resistant line and field isolates (Ariey et al., 2014), and clear-cut examples of natural selection associated with resistance to artemisinin combination therapies in Asia have come from analysis of 91 *P. falciparum* genomes (Cheeseman et al., 2012).

Despite the recent advances in WGS and NGS, the challenges of genomic analyses of metazoan species are, however, still great. The Schistosoma mansoni genome of 380 megabases (Mb) (Protasio et al., 2012) is an order of magnitude larger than the 23 Mb genome of P. falciparum (Gardner et al., 2002) and one order again than the 4 Mb genome of M. tuberculosis (Cole et al., 1998). Under the 50 Helminth Genomes Initiative of the Wellcome Trust Sanger Institute (WTSI) and other projects elsewhere (Blaxter et al., 2012), further helminth draft genomes are becoming available. While sequencing output is increasing, large genomes are fragmented (Parkhill, 2013) and stitching these genomes together into complete scaffolds took years (Holroyd and Sanchez-Flores, 2012). Nevertheless, changes in sequencing and mapping technologies are gradually making this process easier and more rapid (Chin et al., 2013; Dong et al., 2013), and the Schistosoma genome is starting to be used to study anthelmintic resistance. For example, WGS facilitated the finding of the locus responsible for oxamniquine resistance in S. mansoni by allowing genome-wide single nucleotide polymorphisms (SNPs) in the progeny of a genetic cross to be mapped against a drug resistance phenotype (Valentim et al., 2013).

As genomic data becomes available and costs of WGS reduce, questions on how to maximize the information from such data become pertinent. Here we consider what is known today about the interdisciplinary approaches of molecular epidemiology and mathematical modelling. We discuss the current and newly developing techniques available in population genetics and genomics and how these could, and should, be incorporated into novel mathematical predictive models, primarily using *Schistosoma* spp. as a case study. Whilst many excellent mathematical models already exist on schistosome epidemiology, beyond the scope of this current article, here we focus on those incorporating genetics and genomics. We specifically address what information is urgently needed to parameterize mathematical models aimed to help us elucidate: (1) key questions relating to the basic biological and transmission potential of schistosome populations under differing MDA pressures; (2) transmission cut-off points under repeated MDA,

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informing when treatments can be stopped and/or scaled down without population infection recrudescing; (3) the potential gauge of if, and when, drug resistance will arise and how, where and how fast it may spread; (4) the role of non-human zoonotic reservoirs in maintaining transmission under differential selective pressures; and (5) the potential for novel introgressed hybrid schistosomes to emerge and establish. We conclude by highlighting priority areas for future cross-disciplinary research in this emerging area and how findings can be translated into policy.

### 2. SCHISTOSOMES AS A 'MODEL' FOR ANTHELMINTIC MDA

Schistosomes, the causative agent of schistosomiasis, are one of the major NTDs targeted by MDA. Schistosoma spp. are indirectly transmitted dioecious trematode macroparasites, with an asexual stage in an intermediate host snail and a sexual stage within a definitive mammalian host. Schistosomiasis infects >240 million people with >750 million at risk, of which over 90% are within sub-Saharan Africa (SSA) (Steinmann et al., 2006). Two forms of human schistosomiasis are recognized - urogenital and intestinal. Urogenital schistosomiasis, from infection by Schistosoma haematobium, is associated with haematuria, bladder damage and a risk of progression to kidney failure and bladder cancer. More than 150,000 people die annually from S. haematobium-related kidney failure. Intestinal schistosomiasis is predominantly caused by S. mansoni in SSA and Schistosoma japonicum in Asian foci, and is associated with bloody diarrhoea, hepatosplenomegaly and liver failure (Gryseels et al., 2006). Schistosomiasis is primarily treated and controlled through MDA with praziquantel (PZQ) to school-age children in endemic districts. The Schistosomiasis Control Initiative (SCI), based at Imperial College London, has been instrumental in providing over 100 million PZQ treatments across parts of SSA from 2003 to 2014 (Fenwick et al., 2009; Webster et al., 2014). Vast quantities of the drug are donated through private-public partnerships including by pharmaceutical companies such as Merck-KGaA who have pledged to increase their donations and provide 250 million PZQ tablets annually for SSA by 2016. As treatment efforts are stepped-up, stronger selection pressures will be imposed on populations of Schistosoma spp. (Webster et al., 2008, 2014).

The genomes of the three major schistosome species infecting humans have been published -S. mansoni (Berriman et al., 2009), S. haematobium (Young et al., 2012) and S. japonicum (Schistosoma japonicum Genome and

Functional Analysis, 2009), and have been made accessible through SchistoDB (Zerlotini et al., 2013). Unpublished draft genome data for a further eight *Schistosoma* spp. are also now available from the WTSI (http://www. sanger.ac.uk/research/initiatives/globalhealth/research/helminthgenomes/). While these data have already been put to use in studies on functional (Protasio et al., 2013; Valentim et al., 2013) and comparative genomics (Tsai et al., 2013), work on population genomics is in its relative infancy.

Microsatellite studies have instead been the mainstay of recent Schistosoma evolutionary analysis, including population genetic studies examining potential changes to microsatellite diversity of S. mansoni before and after PZQ MDA. A key 2005-2006 study in Tanzania (Norton et al., 2010), for instance, revealed a significant reduction in the allelic richness of S. mansoni following PZQ, both within individuals treated and most notably also at the population level, as revealed by a similar reduction in genetic diversity observed in the youngest cohort of previously untreated children. Data from Senegal collected in 2007-2008 in a similar study used microsatellites to analyse miracidia collected from 12 children pre- and post-treatment/s. Those authors, however, found no significant changes to allelic richness or expected heterozygosity in S. mansoni before and after two rounds of treatment with PZQ amongst their small sample group (Huyse et al., 2013). In addition, no reduction in genetic diversity following 4 years of MDA was observed in parasites from children in Western Kenya (Lelo et al., 2014). Likewise, a microsatellite study in Brazil (Blanton et al., 2011) which compared the similarity of S. mansoni populations that survived PZQ treatment with susceptible worms also found no significant difference according to the differentiation index (Jost, 2008). Such inconsistencies could be due to differences in sample sizes used or due to true biological differences. Future molecular and mathematical modelling analyses would help elucidate this, by, for instance, estimating the minimum number of miracidia per individual required and/or the number of individual host samples required to provide robust estimates of genetic diversity (French et al., 2012). It should also be acknowledged that the number of microsatellites needed to accurately infer an effect varies greatly with the nature of the question, the scale of the analyses, the specific parameters to be estimated as well as the sample size. Any apparent absence of differentiation or change at neutral markers is not, however, necessarily indicative of whole genome processes (Allendorf et al., 2010). A study on Atlantic cod (Pampoulie et al., 2006), for instance, showed that very little genetic differentiation  $(F_{st})$  was observed over nine microsatellite loci, but that substantial variation was taking place at the PanI locus, which is known

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to be under natural selection. The level of detail that genomics can now provide, particularly in terms of parasite population structure, transmission dynamics, and genetic diversity and how these are affected by MDA, as well as the more specific effects of treatment on drug resistance and other genetic traits such as virulence, will greatly aid parameterization of transmission models thereby helping policy makers formulate informed decisions on how to maximize control of these NTDs while minimizing the risk of development and/or spread of drug resistance.

#### 2.1 Micro-evolutionary processes

Some of the most genetically explicit models for multi-host parasites focus on basic population biology (Prugnolle et al., 2005a; Criscione et al., 2005). Analyses of genetic variation in parasites at different hierarchical levels enables elucidation of parameters such as gene flow, effective population sizes and breeding units, all information relevant for understanding the potential rate of spread of important traits such as drug resistance (Anderson and May, 1991). Schistosomes have, however, several unique aspects of their biology, distinguishing them from other trematodes. Prugnolle and colleagues used an infinite island model to explore the alternation of sexual and asexual reproduction in monoecious trematodes on the partitioning of genetic variance among and within definitive hosts (Prugnolle et al., 2005a). Variation in reproductive success of clones was found to be important in shaping the distribution of the genetic variability both within and among definitive hosts (Prugnolle et al., 2005a, 2005b) and F<sub>is</sub> (a measure of inbreeding) increased with higher levels of self-fertilization (Prugnolle et al., 2005a), limiting the scope for gene flow within these populations. Schistosomes are believed to have no or low levels of inbreeding (Basch and Basch, 1984; Prugnolle et al., 2005c; Huyse et al., 2009), and hence it might be predicted that F<sub>is</sub> values would be lower for these organisms than for monoecious trematodes, with future models fitted to field molecular data helping to elucidate this.

The same group then parameterized a model for dioecious trematodes and compared their theoretical findings with empirical *S. mansoni* data from Guadeloupe (Prugnolle et al., 2005b). These models examined differential life-history traits such as sex-biased dispersal or clonal reproductive success (Prugnolle et al., 2002). Such characterizing of host and parasite population genetic structure and estimating gene flow among populations is essential for understanding coevolutionary interactions between hosts and parasites (Prugnolle et al., 2005c). Their models, however, assume nonoverlapping

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generations. Adult schistosomes can live for, on average 6-15 and up to 40 years within a human host, and as hosts are repeatedly exposed over their lifetime, generations of the adult schistosome populations can and do overlap. It is unknown what the effects of overlapping generations are with regards to population structure among hosts and if overlapping generations might impact the genetic effects of drug treatment. Inclusion of overlapping generations in mathematical models would undoubtedly increase the mathematical complexity (Prugnolle et al., 2005a), but may be in many cases the most biologically realistic scenario. In addition it is known that schistosome males can competitively mate (Tchuem Tchuenté et al., 1995; Tchuem Tchuenté et al., 1996; Webster et al., 2007) and therefore a male which survived treatment could mate with either a newly infecting female, a surviving juvenile female or a mature female which was either resistant to the drug, or which was protected from the drug by a dying male. New males from subsequent generations could also competitively mate with females from earlier generations, leading to pairs from these overlapping generations. Such competition among males will lead to an increased variance in male reproductive success. This could plausibly increase with drug treatment, in comparison to natural death and generation turnover, as the new cohorts of males infecting the hosts posttreatment may be fitter than those which have been exposed to the drugs, but could mate with previously exposed, but surviving females. The inclusion of overlapping generations in mathematical model design could thus have profound implications on the predicted spread of drug resistance via sexual reproduction. Work by Xu et al. (2006) has indeed demonstrated the importance of incorporating mating structure into model design, where he showed the potential maintenance of drug-resistant strains of schistosomes where generations overlap in comparison to simpler models without mating structure. Furthermore, such mating structure models suggested that multiple strains of drug-resistant parasites are likely to be favoured as the treatment rate increases (Xu et al., 2006). Models produced to date have also suggested that the likelihood that these resistant strains will increase in frequency also depend on the interplay between their relative fitness, the costs of resistance and the degree of selection pressure by the drug treatments (Feng et al., 2001).

#### 2.2 Macro-evolutionary processes

Molecular models for macro-epidemiological processes directly relevant to public health policy makers are scarce, despite the fact that population genetics and epidemiology both extend basic biological processes at the

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individual level to the population level, and clearly come together to model drug resistance (Levin et al., 1997). The difference in the spread of drug-resistant genes through a parasite population to that of drug-resistant parasites through a host population is that drug-resistant alleles replace sensitive alleles depending on their relative fitness, whilst drug-resistant parasite densities increase according to their absolute fitness (Paterson and Viney, 2000). This difference is of greater importance in complex parasite systems where high levels of genetic diversity are required to complete the life cycle, such as schistosomes (Rollinson et al., 2009), with stronger constraining selective pressures acting on the parasites at different life cycle stages than, for example, directly transmitted viral pathogens. Because the rate of increase of a parasite population (and therefore the density of the parasite population) depends on  $R_0$ , the epidemiology of anthelmintic resistance cannot be determined without using a model which incorporates the underlying genetics of resistance (Paterson and Viney, 2000). Smith and colleagues used estimates of the absolute fitness of different parasite genotypes within an epidemiological framework to model the effects of under dosing, treatment strategies and mating probabilities on anthelmintic resistance (Smith et al., 1999). Such a model demonstrates how population genetics can help build theoretical models of infectious disease to understand patterns of transmission in the field.

# 3. THE ROLE OF GENETICS AND GENOMICS IN MATHEMATICAL MODELS

# 3.1 Elucidate the basic biology and transmission potential of schistosomes

#### 3.1.1 Population structure

In many countries the majority of MDA programmes, particularly for schistosomiasis and soil-transmitted helminths (STH), target school-aged children. The effects that such treatment strategies have on parasite transmission dynamics, as well as the potential selection pressures, depend on a range of factors. These include at least three directly relating to *refugia* (the proportion of the parasite population not exposed to the drug): (1) the proportion of school-aged children who attend school and therefore receive treatment, (2) the proportion of the population that are school aged and (3) the proportion of the total parasite population harboured by this targeted treatment group. Additional key factors include drug efficacy, life-history costs/trade-offs of resistance and parasite population diversity, structure and transmission dynamics, such as how different age groups are exposed to eggs or infective larvae produced by these school-aged children and *vice versa* (Anderson et al., 2013). These factors affect ongoing transmission and reinfection of treated, and untreated, individuals and influence the potential development, rate, and spread, of drug-resistant strains.

Models can aid understanding about potential benefits that school-based MDA may have on untreated groups. For example, if parasite population structure, elucidated through genetics and/or genomics, indicates that children and adults were found to be infected from a similar genetic pool of parasites (i.e. no genetic differentiation of parasites between children and adults), then treating children may potentially decrease infection in the untreated adult communities, recently termed the 'herd impact' of a treatment programme (Anderson et al., 2013). Conversely, if parasites in children only tend to circulate within their age groups, then infection intensities in adults will be unaffected by only treating the children.

Although measuring transmission rates in multi-host systems is difficult, data on genetic variation within an individual- and population-level hierarchy can also enable measurements of genetic structure and associated rates of gene flow (Weir and Cockerham, 1984). Genomic and gene flow data can likewise be used to build transmission trees, including those aimed to identify, for certain microparasites at least, the origins of any new infections (Kao et al., 2014). While these approaches may have lower resolution in metazoan parasites, due to their slower rates of molecular evolution, multilocus and genomic approaches will allow us to approximate intraspecific phylogenies and elucidate transmission between hosts, as has been demonstrated for Ascaris (Criscione et al., 2010). Such data become vitally important as control programmes move towards elimination, highlighting key individuals or subpopulations driving reinfections. Examples of where genetic data have already informed public health policy include a study on Ascaris in pigs and humans in Guatemala, where even though infections were sympatric, there appeared to be, using the molecular tools available at the time, little gene flow between the parasite populations indicating no transmission between the two host species (Anderson et al., 1993). Conversely, two other more recent studies have indicated cross transmission between the Ascaris lumbricoides and Ascaris suum species, with, furthermore, up to 4% and 7% of Ascaris appearing as hybrids, which raises a number of potential implications for long-term evolutionary dynamics (Criscione et al., 2007). Models have already been used in directly transmitted pathogens, including sexually transmitted diseases, where contact

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tracing data may not be complete, but where genome data can inform on infection networks (e.g. HIV transmission in a dental practice (Ou et al., 1992)) as well as theoretical pathogen models using evolutionary trees resulting from different evolutionary processes (Nee et al., 1994). In microparasites with rapid in-host evolution, sensitivity of phylogenetic-based networks may be reduced (Resik et al., 2007). Similar lack of contact tracing exists for indirectly transmitted pathogens such as STHs and schistosomes and microparasite models incorporating similar genomic data may be developed for more complex indirect transmission networks (Gupta et al., 1996), although these may also be highly dependent on host immunological factors (Anderson et al., 1989).

At present mathematical models of indirectly transmitted parasites often assume that exposure to eggs or larvae across all age groups is random and independent of the relative contribution of infective stages from each age group and maintained transmission. However, the spatial structure of concomitant parasite transmission between age groups is unlikely to be random and even less so with MDA programmes targeting specific groups of individuals. Therefore, models should incorporate such heterogeneous mixing (Chan et al., 1994). An additional complication is that transmission dynamics and population biology are likely to change if MDA reduces parasite transmission significantly (Klepac et al., 2013). Models for such organisms, with the exception of (Gurarie and King, 2005), also assume that hosts are exposed to a common source of infection. However, even on a very local scale, parasites have been shown, using population genetics, to have focal transmission (Criscione et al., 2010) independent of the among age-group population structures, negating some of the classic models for parasite transmission.

Above, we have discussed how population genetics can inform on specific treatment scenarios, and be used to predict gene flow between certain individual hosts, or host groups. On a larger and more basic scale, population genetics can inform on the very basis of what types of models should be used for certain diseases. At present some network contact models estimate transmission patterns purely from host behaviour. The use of population genetics and genomics enables elucidation of contact network structures, even at the most basic level. Questions such as whether transmission is random or nonrandom, and therefore which model is appropriate to fit the data, can be answered, as has already been initiated for *A. lumbricoides* in Nepal (Criscione et al., 2010). This is particularly important for multi-host parasites where several transmission

mechanisms could result in a similar profile. To date, many of the theoretical challenges faced by epidemiologists and population geneticists were problems of scale, whilst the use of population genomics greatly diminishes these challenges.

#### 3.1.2 Transmission rates

Changes in the transmission rate of macroparasites may be inferred from longitudinal changes in descriptive statistics (prevalence, infection intensity) or modelled through the force of infection (FOI: the rate at which human hosts acquire parasites). Uganda, for instance, has been treating individuals with PZQ since 2003 with significant reductions in prevalence, infection intensity and FOI after only three rounds of MDA in low-, moderate- and highinfection areas in both treated and untreated children (French et al., 2010). However, Basáñez and colleagues argue that presently there are very few models with the potential to inform on optimal methods at a clinical or epidemiological level to monitor such changes and they outline a number of areas for future model development. These include 'the design of treatment efficacy and effectiveness studies; phenotypic characterisation of responses to treatment; and design of sampling protocols for the study of parasite genetic structure under treatment, thereby facilitating prompt detection of anthelmintic resistance' (Basáñez et al., 2012). Examples of modelling work already carried out in this field include studies examining the effect of density-dependent forces known to act on parasites generally, including schistosomes (Medley and Anderson, 1985) and the effect of human and parasite sample sizes on measuring reductions in genetic diversity in S. mansoni infections post-treatment (French et al., 2012). Both of these factors are vitally important, particularly as control programmes progress and infection intensities reduce.

Genomic techniques can be employed to gain a better understanding of the nature of transmission in endemic settings, including those under differing MDA pressures (Volkman et al., 2012). Within a parasite population, the degree of outbreeding and recombination is linked to the proportion of people harbouring parasites of variable genotypes; this proportion is known to scale with the level of transmission (Anderson et al., 2000). A study on the Thai–Burmese border where transmission of *P. falciparum* has declined from 2000 to 2010 associated a loss of heterozygosity across 96 SNPs with the sampling year (Nkhoma et al., 2013) using logistic regression, therefore multiple genotype infections had significantly declined over time in line with falling transmission. A study in Senegal found a similar

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reduction in the heterozygosity of *P. falciparum* populations as a consequence of public health interventions (Daniels et al., 2013). Nkhoma and colleagues argue that the linear relationship between the carriage of multiple parasite genotypes within human hosts and transmission intensity means that population genetics can be used as a reliable and inexpensive method of tracking temporal changes in transmission intensity (Nkhoma et al., 2013). Despite very different life cycles, the effects seen in *P. falciparum* are likely to be replicated in Schistosoma spp. In both parasites, the total populations are subdivided within each definitive host (Anopheles in the case of P. falciparum and humans in the case of Schistosoma spp.), meaning that sexual reproduction for any individual parasite is possible only with a small fraction of organisms from the total population. This presents barriers to gene flow and outbreeding and so the reductions in heterozygosity are enhanced in both species. It may be expected, however, to occur more slowly in schistosomes, due to a longer generation time, the relatively higher intensities of infections in humans than in the mosquitoes and the different timing of sexual reproduction in the two life cycles.

#### 3.1.3 Spatial heterogeneity

Modelling spatial and demographic heterogeneity with the aim of understanding fundamental processes underlying infection dynamics provides a framework for evaluating potential control strategies for infectious diseases (Paterson and Viney, 2000). Using well-documented and commonly modelled systems, such as measles, social and geographical structure in contact networks have been deduced with heterogeneity in transmission rates within families, between children at school and between communities (Keeling et al., 1997). Models for macroparasites may also highlight key social and geographical groups where transmission is high. However, in indirect life cycles, this is hard to do from host behaviour and contact monitoring. Parasite population genetics and genomics can ultimately inform on transmission structure. Heterogeneity in infection patterns are biological realities and must be incorporated into models (Paterson and Viney, 2000) improving their fit to empirical data. Kao et al. (2014) reviewed the use of WGS in contact tracing models to reveal points of control and predict the direction of the spread of diseases for microparasites (Kao et al., 2014). They discuss the complexities associated with inferring the epidemiological dynamics of multi-host pathogens, as is often the case for NTDs. Furthermore, these authors explore the difficulties of when microparasite mutation rates are low in comparison to generation times, but that such situations may be resolved using within-host genetic variation to infer properties of between-host transmission (Stack et al., 2013). While these methods may be less powerful in metazoan parasites, whole genome data will certainly reveal significant details of the spatial genetic structure for these organisms (Archie et al., 2009).

## 3.2 Evaluate transmission cut-off points and estimate when to stop MDA

Population genetic mathematical models can also inform on cut-off points for MDA through predicting the levels of infection where disease transmission should not recrudesce (Plaisier et al., 1997; Turner et al., 2013). This has been demonstrated for the NTD trachoma (Chlamydia trachomatis) in communities where MDA of antibiotic eye ointment are used (Lietman et al., 2011). This model included estimates of transmission parameters relating to reinfection from both within or outside the community. The values were robustly estimated from prevalence data at baseline and 24 month follow up. Nevertheless, future additional data on the level of gene flow over time and space and phylogenies of the infections appearing following treatment would enable control programmes to know the true influence of recrudescence and reinfection from within or outside the community. Such data would also inform on the distance that reinfection can occur from. This would aid policy makers in their decisions on when they can halt treatment in a central focus, depending on threshold infection levels in a range of surrounding foci. Population genomic data could also parameterize smaller spatial household models, identifying the extent of gene flow within and between infected subpopulations (Blake et al., 2009). Similar transmission potential parameters could be incorporated into other vectorborne/intermediate host disease elimination models, such as for S. haematobium on Zanzibar, for example, where they are aiming towards elimination (Rollinson et al., 2013). Of particular value would be the use of genetic and genomic data to understand if any detected cases remaining or reappearing were from local transmission or imported cases from the mainland. Such genomic data have already enabled reconstruction of transmission trees for directly transmitted non-NTDs, for example, understanding cross-species transmission in Salmonella (Mather et al., 2013).

Parasite diversity may also strongly affect transmission dynamics, reinfection rates posttreatment and associated thresholds for ending MDA. Strain diversity in trachoma, for instance, is known to affect reinfection levels, as heterogeneity exists in part to evade the human immune system. If many Mathematical Modelling for Molecular Epidemiology

strains become eliminated, then the remaining ones may not be able to reach pretreatment levels due to independent factors such as strain-specific host immunity (Zhang et al., 2004). Incorporating diversity into models predicting MDA cut-off points, may thereby not only greatly enhance their accuracy, but also aid in the understanding of such interventions on the transmission dynamics of the infectious agent, as has recently demonstrated for dengue (Coudeville and Garnett, 2012).

# 3.3 Elucidate the potential evolution and spread of PZQ resistance

Early detection of anthelmintic resistance is vital for controlling the spread of such genotypes. When (Churcher and Basáñez, 2009) and how (French et al., 2012) best to examine human helminth parasite populations posttreatment, have recently been the subject of model-based studies. If PZQ resistance is recessive, drug-resistant alleles could spread through the population to relatively high levels before phenotypic manifestation (Churcher and Basáñez, 2009). There is also evidence for negative density-dependent fecundity in S. mansoni (Medley and Anderson, 1985) and models on helminth life cycles show that density-dependent fecundity, in comparison to that in parasite establishment or mortality (Churcher and Basáñez, 2008) may facilitate the spread of resistance as parasite population intensities decrease with treatment. One of the most important aspects of mathematical models is their direct use to public health policy makers. A recent model based on antibiotic resistance and drug use and how to communicate the extent of problems to policy makers (Laxminarayan and Klugman, 2011) could be adapted for other infections to maximize the speed of implanting changes in control strategies should they be required.

Some modelling work to date has taken into account the life cycle of schistosomiasis by using a time delay function and found that the presence of this delay, i.e. the average time between two adult generations, makes it more likely for resistant strains, for example, to invade and persist in a parasite population (Castillo-Chavez et al., 2008). Furthermore, population genetic analysis of the structure of *S. mansoni* and *S. haematobium* diversity across Africa using microsatellite markers, found that, on the basis of population structuring and high genetic diversity, should drug resistance evolve it would be slow to spread through schistosome populations, at least across large scales (Gower et al., 2013), as there were low levels of gene flow observed between samples from different countries (although high levels of gene flow between samples within countries). As with many parasite

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species, the complex nature of the schistosome life cycle violates assumptions of the Wright—Fisher model by: 1) having highly overlapping generations due to the long reproductive lifespan of adult schistosomes; and 2) nonrandom mating due to focal transmission and the inability to mate with schistosomes in other hosts. These effects make it difficult to make use of genetic variation at neutral sites to understand population size and structure (Balloux and Lehmann, 2012) and to predict how effective natural selection will be in increasing the frequency of positively selected alleles in the face of random drift or constraining selective pressures elsewhere in the complex life cycle. A population genetic model recently developed for malaria, which aids understanding of the emergence of resistance and its early spread (Kim et al., 2014), in this instance under combination drug therapy (something which is not currently available for schistosome treatment), will likely act as a key foundation for other indirectly transmitted parasite genetic models in the near future.

Recent mathematical models on large-scale PZQ administration have shown that the FOI of S. mansoni is reduced throughout communities; even in untreated PZQ naïve individuals, as control programmes progress (French et al., 2010). Such an FOI, however, is calculated from humans, through snails and back into humans, with little knowledge on the relative force between individual life cycle stages. In S. japonicum, an Asian species which has multiple definitive hosts, the driving FOI is the transmission from snail to mammal (Riley et al., 2008), with different mammalian hosts maintaining transmission in different geographical regions (Lu et al., 2010; Rudge et al., 2013). In an S. mansoni focus in Guadeloupe, similar molecular epidemiology studies have indicated that parasite migration is primarily driven by the rodent hosts (Prugnolle et al., 2005c). Little, however, is known about the relative forces and spatial heterogeneities in S. mansoni and S. haematobium between subpopulations of parasites in humans or on the effect of PZQ. Future work needs to expand current FOI models, to include drug-resistance parameters, and determine the driving forces of continued transmission despite repeated drug treatments. As schistosome control programmes progress, empirical and theoretical data warrant further research on PZQ efficacy, and how best to monitor and evaluate disease transmission, to maximize the lifespan of PZQ.

As some countries or regions in countries push towards elimination (Rollinson et al., 2013), biannual treatment with PZQ has been a suggested strategy to further reduce the FOI and halt transmission. One key area that mathematical models should evaluate is the effect of biannual MDA on the

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potential increased selection for resistance, versus the rate of reducing the FOI (French et al., 2010). Models should be fitted to known clearance data post-treatment to elucidate the relative contribution of non-clearance versus reinfection in maintaining high-infection intensities. These models should then incorporate the currently unknown parameters for PZQ resistance, starting with a simple single locus model and progressing to multilocus genotypes. This would inform policy makers on the potential risks of increasing treatment frequencies, versus the potential benefits of reducing FOI, for a range of scenarios for potential genotypic resistance to the drug.

In the absence of any current molecular markers for monitoring potential PZQ resistance, or even a full understanding of the molecular mechanisms of PZQ action (Chan et al., 2013), phenotypic tests have been trialled with some success in both the laboratory and the field (Liang et al., 2001; Lamberton et al., 2010). Accurate phenotypic measures of drug efficacy are a vital requirement for comparison of genomic sequences to locate potential genes and/or regions associated with drug resistance. Complexities arise with several chronic macroparasite infections as methods for phenotypically detecting resistance are often not properly standardized. In schistosomes, the WHO designated phenotype for drug tolerance is lowered 'cure rates' and/ or 'egg reduction rates' as measured by Kato-Katz thick smears (Katz et al., 1972) or urine filtration, depending on the species, before and 14-21 days following treatment (WHO, 2013). Limitations in the sensitivity of such diagnostic tests (Lamberton et al., 2014) may restrict the inferences that can be drawn from any association testing between polymorphisms and reduced treatment efficacy. An important role for modelling will be to account for the limitations in diagnostic accuracy, which is increasingly performed through latent class analysis (Koukounari et al., 2013; Assefa et al., 2014). The most recent WHO manual for evaluating anthelmintic drug efficacy 'tentatively' places the egg reduction rate at approximately 90% for the three main Schistosoma species infecting humans when individuals are treated with 40 mg/kg of PZQ (WHO, 2013). On the basis of these criteria, treatment failures with PZQ, although rare, have been reported (Greenberg, 2013) with systematic non-clearers often observed in the field. Warning also comes from veterinary parasitology with anthelmintic resistance an inevitable consequence of mass anthelmintic treatment, with parasites in some regions being resistant to all major drug classes, leading to total anthelmintic failure (Kaplan and Vidyashankar, 2012; Webster et al., 2014), and threatening the profitability of whole sheep farming industries in Australia (Wolstenholme et al., 2004).

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Care must, however, be taken in using genetic data from populations of larval, or egg, stages as a proxy for adult worm intensity or reproduction (Criscione and Blouin, 2005), or to measure transmission between hosts (Steinauer et al., 2010, 2013). Potential solutions to such issues have involved, for example, estimating the adult population sizes through kinship analysis to either partition miracidia into sibships or assign miracidia to parents of the parasites under investigation (Blouin, 2003; Jones and Ardren, 2003; Criscione and Blouin, 2005; Steinauer et al., 2013). This has also enabled the accurate incorporation of density-dependent factors into models by drawing comparisons between adult population sizes and egg counts at the individual level. Effective population size  $(N_e)$  is an important parameter in evolutionary biology because it quantifies genetic drift, and crucially with regard to MDA and potential drug resistance, the response to selection (Criscione and Blouin, 2005). Ne has a large influence on the overall level of genetic diversity in populations and selection for drug-resistance alleles might be more efficient in parasite populations with a large Ne. The complex life cycles of many NTDs affect the type of model chosen to estimate Ne (Balloux and Lehmann, 2012) and make it more challenging to collect samples from appropriate life cycle stages to infer genetic estimates, and to collect the necessary demographic data, such as generation time, that may be needed to augment these genetic estimates. For example, in many NTDs, such as schistosomes, the eggs from sexual reproduction are passed into the external environment, so that offspring from different infrapopulations are mixed every generation. Criscione and Blouin use a model which subdivides breeders into infrapopulations, nested within a component population, to demonstrate basic demographic factors that control N<sub>e</sub> in macroparasite species (Criscione and Blouin, 2005). They incorporate incomplete mixing, which increases reproductive success of some infrapopulations and discuss the effects of aggregation and crowding on per capita fecundity, both aspects vitally important in future models on the potential rate of spread of drug resistance. They also demonstrate a pronounced sex ratio effect on Ne due to separation of individuals among hosts. Such a model would be greatly enhanced by knowledge gained from kinship analysis through population genetics or genomics, briefly mentioned above (Blouin, 2003; Jones and Ardren, 2003), which would inform on reproductive success and density-dependent factors enabling the accurate estimation on the effective number of breeders in each infrapopulation, which could then be incorporated into models and would be even more important after

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MDA when density-dependent pressures may be reduced on potentially resistant strains.

Apart from details of the population structure and reproductive biology of the parasite population, the speed and extent of spread of drug-resistance alleles will depend on the detailed genetic architecture of drug resistance. Factors include how many loci are involved, how loci interact in determining resistance phenotypes, whether and to what extent the loci are genetically linked and whether resistant alleles are dominant, recessive or something in-between, the relative fitness of resistant genotypes in the presence of drug treatment, the cost of resistance (reduced fitness in the absence of drug treatment) and the degree of selection pressure exerted by treatment on different populations. Basáñez et al. (2012) discuss models capturing some or all of these factors for some parasite species, including a number of schistosome-specific models, but nothing is known about loci underlying clinical failure of PZQ treatment or PZQ resistance, let alone any information to parameterize the other factors required for accurate, model-based prediction of the potential for drug resistance.

## 3.3.1 Using population genomics to understand the mode of PZQ resistance

Circumstantial evidence suggests that PZQ acts on voltage-gated Ca<sup>2+</sup> channels (Doenhoff et al., 2008; Chan et al., 2013). While these insights are important, whole genome approaches enable an unbiased approach to understanding the genetics of drug resistance, avoiding potential biases from prior assumptions about mechanisms of action and/or resistance embodied in the choice of 'candidate genes' for more targeted genotyping approaches. Traditional 'forward' genetics approaches based on analysis of a genetic cross are possible in Schistosoma (Criscione et al., 2009) and have been successfully applied to understanding the genetics of drug resistance to oxamniquine in one isolate (Valentim et al., 2013). Reverse genetic approaches such as transgenesis and RNAi are also available, or under active development for Schistosoma, and while not yet sufficiently reliable for high throughput for 'discovery' of loci underlying resistance phenotypes, such techniques may be valuable in confirming the importance of candidate loci discovered by other approaches. More fundamentally, these kinds of laboratory genetics approaches allow detailed investigation of causal loci in individual resistant isolates, but unless diverse isolates can be looked at - and relatively few schistosomes isolates are now maintained in laboratories, and once introduced from the field rapid genetic bottlenecks occur

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(Gower et al., 2007) – these loci may not be responsible for resistance observed in clinical conditions.

A complementary approach is to investigate genetic variation in natural populations. A conceptually simple approach is to look directly for genetic variation that is associated with a quantifiable phenotype, such as drug resistance (Borrmann et al., 2013; Takala-Harrison et al., 2013; Zhang et al., 2013). The key difficulties for using such approaches in schistosomes at present lie in the lack of a diagnostic test for reduced PZQ efficacy, in part due to the complexity of the parasite genome and life cycle and likely polygenic basis for such resistance. An alternative is to look for the impact of selection caused by drug treatment using genome-wide sequence data, an approach that implicitly assumes that chemotherapy is one of the most important selective forces on these genomes. Methods to detect recent selection are looking for the signals of a selective sweep (Smith and Haigh, 1974), in which a polymorphism under selection increases in frequency rapidly in a population, and the speed of this spread is sufficiently fast that an extended contiguous portion of a chromosome will spread through the population alongside the variant under selection, as there has not been enough time for this unit (haplotype) to be broken up through recombination. Different tests look for different patterns in the distribution of genetic variation across the genome and within populations generated by this process - these tests have been reviewed a number of times recently (Volkman et al., 2012; Oleksyk et al., 2010; Vitti et al., 2013). Examples of the patterns are enhanced linkage disequilibrium and depleted polymorphisms around a region, using tests such as the longrange haplotype test, which in malaria, for example, have detected drug-resistant loci for chloroquine (Wootton et al., 2002) and pyrimiethamine (Nair et al., 2003), or differences in allele frequencies in populations under selection and those without selection. More sophisticated statistical tests build on these approaches e.g. Cross-population Extended Haplotype Homozygosity (XP-EHH) (Sabeti et al., 2007; Grossman et al., 2010). These tests are often performed from in vitro cultures for drug-resistance markers, with linkage mapping using laboratory crosses to correlate segregation patterns in the progeny that are associated with the drug-resistant phenotype (Ferdig et al., 2004; Hayton and Su, 2008; Sanchez et al., 2011).

Knowledge on the effect of MDA on parasite genotypes, such as virulence and drug resistance, and their potential costs, are required to understand the risk of development and then spread. Understanding gene flow between subpopulations also informs on levels of *refugia* as touched upon previously, which is a key strategy for minimizing the risk of drug resistance Mathematical Modelling for Molecular Epidemiology

developing. It is imperative that we understand the complex interactions between minimizing selective pressures, but treating the most heavily infected individuals, by maintaining an optimum level of *refugia* to maximize the short- and long-term control of these NTDs.

Models developed for the demographics of human and malaria movement (Pindolia et al., 2013) and the potential spread of drug-resistant malaria (Anderson, 2009; Lynch and Roper, 2011) indicate the type of predictive maps that can be produced for indirectly transmitted pathogens on regional (Pearce et al., 2009), national (Pindolia et al., 2013) and international (Lynch and Roper, 2011) scales. Given the often transitory migration lifestyles of many fishermen and their families in areas of high *Schistosoma* spp. endemicity, monitoring human movement, potentially through national migration statistics could be extrapolated to these metazoan parasite species.

# 3.4 Elucidate the potential role of non-human definitive hosts

Zoonotic reservoirs affect the transmission dynamics of a disease and can limit the extent to which a pathogen can be controlled or potentially eliminated (Taylor et al., 2001). Work on the zoonotic S. japonicum offers an example of how interdisciplinary research with population genetics and modelling can be done successfully. S. japonicum is unique among schistosome species in that it can infect over 40 mammalian hosts and with zoonotic transmission an important factor in its epidemiology (He et al., 2001). Despite a concerted public health effort over many decades, the Chinese government has been unable to eradicate S. japonicum (Wang et al., 2008). Population genetic analyses found close phylogenetic relationships between strains of S. japonicum in human and rodent hosts in hilly parts of Anhui Province, China using microsatellite markers, whilst schistosomes in the humans in the marshland areas were more closely related to those in bovines, which appear to drive reinfection in those areas (Rudge et al., 2009). Bovines were generally assumed to be the primary reservoir of human infection (Mcmanus et al., 2010), but population genetic analyses greatly increased our understanding of these complex interactions in zoonotic parasites. Knowledge of the genetic similarity and transmission potential between hosts was then used to develop a multi-host model of transmission for S. japonicum (Rudge et al., 2013). This showed that rodents were the only hosts with a basic reproductive number  $(R_0) > 1$  in hilly regions of Anhui, China driving transmission and reinfection in treated humans. This explained the re-emergence of S. japonicum infection in some mountainous

areas of China where the disease was thought to have been eliminated. In marshland areas, where bovines  $R_0 > 1$ , an earlier government organized cull of cattle may have aided transmission control, but similar extreme methods would not have helped in the hilly regions. Rudge and colleagues used a prevalence model framework which predicted that a reduction in rodent density by around 20% would lead to a 40-50% reduction in S. japonicum incidence in humans. This integration of techniques helps inform public health policy makers on how best to maximize control, through giving fixed targets which need to be reached to bring the overall  $R_0$  below 1 and to halt the re-emergence of the disease. Without such population genetic analyses of the parasite strains circulating in these regions, the source of human reinfection after these mass treatment campaigns would have remained misunderstood, dramatically reducing the cost benefit of specific control methods in these regions. Conversely, controlling infections in these host species may potentially induce atypical *refugia* populations, such as wild animal reservoirs to become more epidemiologically important (Bockarie et al., 2013; Webster et al., 2014).

# 3.5 Elucidate the potential role of hybridization and introgression

Hybridization events can have important evolutionary outcomes on species and populations and may improve the fitness of resulting hybrids though the acquisition of adaptive traits. Schistosomatoidae are capable of trans-species mating within the definitive host. Schistosomes are known to hybridize frequently (Steinauer et al., 2010), and reports from Senegal have identified hybridization between *S. haematobium/S. mansoni* (Huyse et al., 2013), *S. haematobium/Schistosoma curassoni* and *S. haematobium/Schistosoma bovis* (Webster et al., 2013) and between *S. mansoni/Schistosoma rodhaini* in western Kenya (Steinauer et al., 2008). The implications of these events for MDA programs have yet to be established, but hybridization may have implications for disease morbidity and drug tolerance and therefore represent a public health concern.

Continued high transmission of *S. haematobium* despite often high MDA coverage have recently been molecularly identified as being due to, at least in part, hybrid infections with *S. bovis* (Huyse et al., 2009; Webster et al., 2013). Since these relatively new PZQ selective pressures have been imposed, any endemic equilibrium of coinfections and hybrids may now be changing. Whether or not these hybrids will maintain transmission and/or evolve into a potentially drug-resistant parasite species remains to

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be elucidated, however, mathematical models for *S. haematobium* and *Schistosoma mattheei* indicate that such evolution is highly unlikely (Kruger, 1990), although this was prior to the introduction of MDA and did not take these extra selective pressures into account. Successful modelling work in the future will require both a better knowledge of the transmission dynamics of schistosomes under MDA pressure, taking into account factors such as hybridization and zoonotic hosts, along with a better understanding of the genetic loci under positive selection for PZQ resistance.

Although not based on parasitic life cycles, models on the origin of species by sympatric speciation (Dieckmann and Doebeli, 1999), with explicit description of genetic determinism, may act as starting points for the development of models which incorporate hybridization and/or drug-resistant alleles. Dieckmann and Doebeli (1999) show that sympatric speciation is a likely outcome of competition for resources, where individuals mate preferentially with like individuals, a situation exacerbated in infections where parasites surviving treatment are more likely to mate with others also surviving either due to potentially harbouring resistant alleles, or increased resistance through hybrid vigour. Such scenarios could theoretically lead to increased drug resistance despite coinfections with susceptible parasites, and may ultimately lead to isolation of drug-resistant strains within individuals harbouring only those parasites which survive treatment.

Research into adaptive evolution may also act as a useful springboard for future models discussed here. Models on plant parasites, for instance, have indicated that evolutionary divergence of parasite phenotypes can be driven by seasonal transmission and associated fitness trade-offs (Hamelin et al., 2011), such as may also occur with annual treatments and reduced density-dependent factors. One such recent model describes how competition explains intra-host diversification of parasites (Rascalou and Gourbiere, 2014). They show that parasite adaptive evolution is faster in highly fragmented parasite populations and for weakly aggregated and virulent parasites, all factors which could be affected by drug-selective pressures, hybridizations and associated trade-offs.

Genomics has the potential to shine a light on these discoveries to elucidate the timing and exact nature of these hybridization events. An exemplary study on the plant pathogenic fungus Zymoseptoria pseudotritici (Stukenbrock et al., 2012) used the nuclear genomes of five individuals to investigate a recent hybridization event. This species shows an unusual pattern of genome-wide diversity, with the genome broken up into small (5.8 kb) stretches of very high haplotype diversity interspersed between

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equally long sections showing no differentiation within the population. This mosaic pattern of haplotypes is indicative of a recent hybridization event followed by a population bottleneck. Estimates of recombination rate and mutation rate in this species allowed two different, approximately congruent estimates of the timing of this hybridization event, from data on the size of the haplotype blocks and the number of point mutations occurring in the genome. It is important to note that both understanding the pattern of hybridization, and dating the founding event for these hybrids was only possible through a genome-level analysis: if only individual genes had been isolated, then the global picture that this study has unearthed would have been lost. Through applying these kinds of methods to WGS data from hybrid populations it should be possible to gain a more complete picture of the nature and timing of introgression between Schistosoma species. Understanding how often new populations of hybrids are founded, how long they persist and how their population genetics differs from parental populations will be important in understanding how these populations are likely to respond to MDA and the scope for PZQ resistance to spread within and between populations.

### 4. CONCLUSIONS

Accurately parameterized mathematical models incorporating genetic or genomic data can, for example, inform on rates of changes of schistosome phenotypes or genotypes associated with drug resistance, so that monitoring and evaluation studies can understand what they need to monitor, how and when is best to monitor, and advise on optimal treatment strategies to maximize the gains from limited resources. Although the cost of NGS has fallen exponentially in recent years, the outlay of sequencing all 380 Mb of the schistosome genome remains currently beyond the financial capacity of most institutions, although RAD-seq or exon-capture may represent a more cost-effective alternative (Gilabert and Wasmuth, 2013). When dealing with a disease that affects the very poorest in the world, the most useful public health interventions are those which cost the least and are broadly sustainable; therefore it is important that this technology is targeted to answer the most relevant public health questions. These NGS technologies, to complement population genetic data available from methodologies such as microsatellites, can thus be combined with mathematical models, and we anticipate that the next few years will represent a highly exciting and

important era in such trans-disciplinary research of profound theoretical and applied importance.

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#### REFERENCES

- Allendorf, F.W., Hohenlohe, P.A., Luikart, G., 2010. Genomics and the future of conservation genetics. Nat. Rev. Genet. 11, 697–709.
- Anderson, R.M., May, R.M., 1991. Infectious Diseases of Humans: Dynamics and Control. Oxford University Press, New York.
- Anderson, R.M., May, R.M., Gupta, S., 1989. Non-linear phenomena in host-parasite interactions. Parasitology 99 (Suppl.), S59–S79.
- Anderson, R.M., Truscott, J.E., Pullan, R.L., Brooker, S.J., Hollingsworth, T.D., 2013. How effective is school-based deworming for the community-wide control of soil-transmitted helminths? PLoS Negl. Trop. Dis. 7, e2027.
- Anderson, T., 2009. Mapping the spread of malaria drug resistance. PLoS Med. 6, e1000054.
- Anderson, T.J., Haubold, B., Williams, J.T., Estrada-Franco, J.G., Richardson, L., Mollinedo, R., Bockarie, M., Mokili, J., Mharakurwa, S., French, N., Whitworth, J., Velez, I.D., Brockman, A.H., Nosten, F., Ferreira, M.U., Day, K.P., 2000. Microsatellite markers reveal a spectrum of population structures in the malaria parasite *Plasmodium falciparum*. Mol. Biol. Evol. 17, 1467–1482.
- Anderson, T.J., Romero-Abal, M.E., Jaenike, J., 1993. Genetic structure and epidemiology of *Ascaris* populations: patterns of host affiliation in Guatemala. Parasitology 107 (Pt 3), 319–334.
- Archie, E.A., Luikart, G., Ezenwa, V.O., 2009. Infecting epidemiology with genetics: a new frontier in disease ecology. Trends Ecol. Evol. 24, 21–30.
- Ariey, F., Witkowski, B., Amaratunga, C., Beghain, J., Langlois, A.C., Khim, N., Kim, S., Duru, V., Bouchier, C., MA, L., Lim, P., Leang, R., Duong, S., Sreng, S., Suon, S., Chuor, C.M., Bout, D.M., Menard, S., Rogers, W.O., Genton, B., Fandeur, T., Miotto, O., Ringwald, P., Le Bras, J., Berry, A., Barale, J.C., Fairhurst, R.M., Benoit-Vical, F., Mercereau-Puijalon, O., Menard, D., 2014. A molecular marker of artemisinin-resistant *Plasmodium falciparum* malaria. Nature 505, 50–55.
- Assefa, L.M., Crellen, T., Kepha, S., Kihara, J.H., Njenga, S.M., Pullan, R.L., Brooker, S.J., 2014. Diagnostic accuracy and cost-effectiveness of alternative methods for detection of soil-transmitted helminths in a post-treatment setting in western Kenya. PLoS Negl. Trop. Dis. 8, e2843.
- Balloux, F., Lehmann, L., 2012. Substitution rates at neutral genes depend on population size under fluctuating demography and overlapping generations. Evol. Int. J. Org. Evol. 66, 605–611.
- Basáñez, M.G., Mccarthy, J.S., French, M.D., Yang, G.J., Walker, M., Gambhir, M., Prichard, R.K., Churcher, T.S., 2012. A research agenda for helminth diseases of humans: modelling for control and elimination. PLoS Negl. Trop. Dis. 6, e1548.

- Basch, P.F., Basch, N., 1984. Intergeneric reproductive stimulation and parthenogenesis in *Schistosoma mansoni*. Parasitology 89 (Pt 2), 369–376.
- Berriman, M., Haas, B.J., Loverde, P.T., Wilson, R.A., Dillon, G.P., Cerqueira, G.C., Mashiyama, S.T., Al-Lazikani, B., Andrade, L.F., Ashton, P.D., Aslett, M.A., Bartholomeu, D.C., Blandin, G., Caffrey, C.R., Coghlan, A., Coulson, R., Day, T.A., Delcher, A., Demarco, R., Djikeng, A., Eyre, T., Gamble, J.A., Ghedin, E., Gu, Y., Hertz-Fowler, C., Hirai, H., Hirai, Y., Houston, R., Ivens, A., Johnston, D.A., Lacerda, D., Macedo, C.D., Mcveigh, P., Ning, Z., Oliveira, G., Overington, J.P., Parkhill, J., Pertea, M., Pierce, R.J., Protasio, A.V., Quail, M.A., Rajandream, M.A., Rogers, J., Sajid, M., Salzberg, S.L., Stanke, M., Tivey, A.R., White, O., Williams, D.L., Wortman, J., Wu, W., Zamanian, M., Zerlotini, A., Fraser-Liggett, C.M., Barrell, B.G., El-Sayed, N.M., 2009. The genome of the blood fluke Schistosoma mansoni. Nature 460, 352–358.
- Blake, I.M., Burton, M.J., Bailey, R.L., Solomon, A.W., West, S., Munoz, B., Holland, M.J., Mabey, D.C., Gambhir, M., Basanez, M.G., Grassly, N.C., 2009. Estimating household and community transmission of ocular *Chlamydia trachomatis*. PLoS Negl. Trop. Dis. 3, e401.
- Blanton, R.E., Blank, W.A., Costa, J.M., Carmo, T.M., Reis, E.A., Silva, L.K., Barbosa, L.M., Test, M.R., Reis, M.G., 2011. *Schistosoma mansoni* population structure and persistence after praziquantel treatment in two villages of Bahia, Brazil. Int. J. Parasitol. 41, 1093–1099.
- Blaxter, M., Kumar, S., Kaur, G., Koutsovoulos, G., Elsworth, B., 2012. Genomics and transcriptomics across the diversity of the Nematoda. Parasite Immunol. 34, 108–120.
- Blouin, M.S., 2003. DNA-based methods for pedigree reconstruction and kinship analysis in natural populations. Trends Ecol. Evol. 18, 503–511.
- Bockarie, M.J., Kelly-Hope, L.A., Rebollo, M., Molyneux, D.H., 2013. Preventive chemotherapy as a strategy for elimination of neglected tropical parasitic diseases: endgame challenges. Philos. Trans. R. Soc. Lond. Ser. B, Biol. Sci. 368, 20120144.
- Borrmann, S., Straimer, J., Mwai, L., Abdi, A., Rippert, A., Okombo, J., Muriithi, S., Sasi, P., Kortok, M.M., Lowe, B., Campino, S., Assefa, S., Auburn, S., Manske, M., Maslen, G., Peshu, N., Kwiatkowski, D.P., Marsh, K., Nzila, A., Clark, T.G., 2013. Genome-wide screen identifies new candidate genes associated with artemisinin susceptibility in *Plasmodium falciparum* in Kenya. Sci. Rep. 3, 3318.
- Bright, A.T., Winzeler, E.A., 2013. Epidemiology: resistance mapping in malaria. Nature 498, 446-447.
- Castillo-Chavez, C., Feng, Z., Xu, D., 2008. A schistosomiasis model with mating structure and time delay. Math. Biosci. 211, 333–341.
- Chan, J.D., Zarowiecki, M., Marchant, J.S., 2013. Ca(2)(+) channels and praziquantel: a view from the free world. Parasitol. Int. 62, 619–628.
- Chan, M.S., Guyatt, H.L., Bundy, D.A., Medley, G.F., 1994. The development and validation of an age-structured model for the evaluation of disease control strategies for intestinal helminths. Parasitology 109 (Pt 3), 389–396.
- Cheeseman, I.H., Miller, B.A., Nair, S., Nkhoma, S., Tan, A., Tan, J.C., Al Saai, S., Phyo, A.P., Moo, C.L., Lwin, K.M., Mcgready, R., Ashley, E., Imwong, M., Stepniewska, K., Yi, P., Dondorp, A.M., Mayxay, M., Newton, P.N., White, N.J., Nosten, F., Ferdig, M.T., Anderson, T.J., 2012. A major genome region underlying artemisinin resistance in malaria. Science 336, 79–82.
- Chin, C.S., Alexander, D.H., Marks, P., Klammer, A.A., Drake, J., Heiner, C., Clum, A., Copeland, A., Huddleston, J., Eichler, E.E., Turner, S.W., Korlach, J., 2013. Nonhybrid, finished microbial genome assemblies from long-read SMRT sequencing data. Nat. Methods 10, 563–569.

Mathematical Modelling for Molecular Epidemiology

- Churcher, T.S., Basáñez, M.G., 2008. Density dependence and the spread of anthelmintic resistance. Evolution 62, 528–537.
- Churcher, T.S., Basáñez, M.G., 2009. Sampling strategies to detect anthelmintic resistance: the perspective of human onchocerciasis. Trends Parasitol. 25, 11–17.
- Cole, S.T., Brosch, R., Parkhill, J., Garnier, T., Churcher, C., Harris, D., Gordon, S.V., Eiglmeier, K., Gas, S., Barry 3rd, C.E., Tekaia, F., Badcock, K., Basham, D., Brown, D., Chillingworth, T., Connor, R., Davies, R., Devlin, K., Feltwell, T., Gentles, S., Hamlin, N., Holroyd, S., Hornsby, T., Jagels, K., Krogh, A., Mclean, J., Moule, S., Murphy, L., Oliver, K., Osborne, J., Quail, M.A., Rajandream, M.A., Rogers, J., Rutter, S., Seeger, K., Skelton, J., Squares, R., Squares, S., Sulston, J.E., Taylor, K., Whitehead, S., Barrell, B.G., 1998. Deciphering the biology of *Mycobacterium tuberculosis* from the complete genome sequence. Nature 393, 537–544.
- Coudeville, L., Garnett, G.P., 2012. Transmission dynamics of the four dengue serotypes in southern Vietnam and the potential impact of vaccination. PLoS One 7, e51244.
- Criscione, C.D., Anderson, J.D., Sudimack, D., Peng, W., Jha, B., Williams-Blangero, S., Anderson, T.J., 2007. Disentangling hybridization and host colonization in parasitic roundworms of humans and pigs. Proc. R. Soc. Biol. Sci. 274, 2669–2677.
- Criscione, C.D., Anderson, J.D., Sudimack, D., Subedi, J., Upadhayay, R.P., Jha, B., Williams, K.D., Williams-Blangero, S., Anderson, T.J., 2010. Landscape genetics reveals focal transmission of a human macroparasite. PLoS Negl. Trop. Dis. 4, e665.
- Criscione, C.D., Blouin, M.S., 2005. Effective sizes of macroparasite populations: a conceptual model. Trends Parasitol. 21, 212–217.
- Criscione, C.D., Poulin, R., Blouin, M.S., 2005. Molecular ecology of parasites: elucidating ecological and microevolutionary processes. Mol. Ecol. 14, 2247–2257.
- Criscione, C.D., Valentim, C.L., Hirai, H., Loverde, P.T., Anderson, T.J., 2009. Genomic linkage map of the human blood fluke *Schistosoma mansoni*. Genome Biol. 10, R71.
- Daniels, R., Chang, H.H., Sene, P.D., Park, D.C., Neafsey, D.E., Schaffner, S.F., Hamilton, E.J., Lukens, A.K., Van Tyne, D., Mboup, S., Sabeti, P.C., Ndiaye, D., Wirth, D.F., Hartl, D.L., Volkman, S.K., 2013. Genetic surveillance detects both clonal and epidemic transmission of malaria following enhanced intervention in Senegal. PLoS One 8, e60780.
- Dieckmann, U., Doebeli, M., 1999. On the origin of species by sympatric speciation. Nature 400, 354–357.
- Doenhoff, M.J., Cioli, D., Utzinger, J., 2008. Praziquantel: mechanisms of action, resistance and new derivatives for schistosomiasis. Curr. Opin. Infect. Dis. 21, 659–667.
- Dong, Y., Xie, M., Jiang, Y., Xiao, N., Du, X., Zhang, W., Tosser-Klopp, G., Wang, J., Yang, S., Liang, J., Chen, W., Chen, J., Zeng, P., Hou, Y., BIAN, C., Pan, S., Li, Y., Liu, X., Wang, W., Servin, B., Sayre, B., Zhu, B., Sweeney, D., Moore, R., Nie, W., Shen, Y., Zhao, R., Zhang, G., Li, J., Faraut, T., Womack, J., Zhang, Y., Kijas, J., Cockett, N., Xu, X., Zhao, S., Wang, J., Wang, W., 2013. Sequencing and automated whole-genome optical mapping of the genome of a domestic goat (*Capra hircus*). Nat. Biotechnol. 31, 135–141.
- Downing, T., Imamura, H., Decuypere, S., Clark, T.G., Coombs, G.H., Cotton, J.A., Hilley, J.D., De Doncker, S., Maes, I., Mottram, J.C., Quail, M.A., Rijal, S., Sanders, M., Schonian, G., Stark, O., Sundar, S., Vanaerschot, M., Hertz-Fowler, C., Dujardin, J.C., Berriman, M., 2011. Whole genome sequencing of multiple *Leishmania donovani* clinical isolates provides insights into population structure and mechanisms of drug resistance. Genome Res. 21, 2143–2156.
- Farhat, M.R., Shapiro, B.J., Kieser, K.J., Sultana, R., Jacobson, K.R., Victor, T.C., Warren, R.M., Streicher, E.M., Calver, A., Sloutsky, A., Kaur, D., Posey, J.E., Plikaytis, B., Oggioni, M.R., Gardy, J.L., Johnston, J.C., Rodrigues, M.,

Tang, P.K., Kato-Maeda, M., Borowsky, M.L., Muddukrishna, B., Kreiswirth, B.N., Kurepina, N., Galagan, J., Gagneux, S., Birren, B., Rubin, E.J., Lander, E.S., Sabeti, P.C., Murray, M., 2013. Genomic analysis identifies targets of convergent positive selection in drug-resistant *Mycobacterium tuberculosis*. Nat. Genet. 45, 1183–1189.

- Feng, Z., Curtis, J., Minchella, D.J., 2001. The influence of drug treatment on the maintenance of schistosome genetic diversity. J. Math. Biol. 43, 52–68.
- Fenwick, A., Webster, J.P., Bosque-Oliva, E., Blair, L., Fleming, F.M., Zhang, Y., Garba, A., Stothard, J.R., Gabrielli, A.F., Clements, A.C., Kabatereine, N.B., Toure, S., Dembele, R., Nyandindi, U., Mwansa, J., Koukounari, A., 2009. The Schistosomiasis Control Initiative (SCI): rationale, development and implementation from 2002– 2008. Parasitology 136, 1719–1730.
- Ferdig, M.T., Cooper, R.A., Mu, J., Deng, B., Joy, D.A., Su, X.Z., Wellems, T.E., 2004. Dissecting the loci of low-level quinine resistance in malaria parasites. Mol. Microbiol. 52, 985–997.
- French, M.D., Churcher, T.S., Basanez, M.G., Norton, A.J., Lwambo, N.J., Webster, J.P., 2012. Reductions in genetic diversity of *Schistosoma mansoni* populations under chemotherapeutic pressure: the effect of sampling approach and parasite population definition. Acta Trop 128 (2), 196–205.
- French, M.D., Churcher, T.S., Gambhir, M., Fenwick, A., Webster, J.P., Kabatereine, N.B., Basáñez, M.G., 2010. Observed reductions in *Schistosoma mansoni* transmission from large-scale administration of praziquantel in Uganda: a mathematical modelling study. PLoS Negl. Trop. Dis. 4, e897.
- Gardner, M.J., Hall, N., Fung, E., White, O., Berriman, M., Hyman, R.W., Carlton, J.M., Pain, A., Nelson, K.E., Bowman, S., Paulsen, I.T., James, K., Eisen, J.A., Rutherford, K., Salzberg, S.L., Craig, A., Kyes, S., Chan, M.S., Nene, V., Shallom, S.J., Suh, B., Peterson, J., Angiuoli, S., Pertea, M., Allen, J., Selengut, J., Haft, D., Mather, M.W., Vaidya, A.B., Martin, D.M., Fairlamb, A.H., Fraunholz, M.J., Roos, D.S., Ralph, S.A., Mcfadden, G.I., Cummings, L.M., Subramanian, G.M., Mungall, C., Venter, J.C., Carucci, D.J., Hoffman, S.L., Newbold, C., Davis, R.W., Fraser, C.M., Barrell, B., 2002. Genome sequence of the human malaria parasite *Plasmodium falciparum*. Nature 419, 498–511.
- Gilabert, A., Wasmuth, J.D., 2013. Unravelling parasitic nematode natural history using population genetics. Trends Parasitol. 29, 438–448.
- Gower, C.M., Gouvras, A.N., Lamberton, P.H., Deol, A., Shrivastava, J., Mutombo, P.N., Mbuh, J.V., Norton, A.J., Webster, B.L., Stothard, J.R., Garba, A., Lamine, M.S., Kariuki, C., Lange, C.N., Mkoji, G.M., Kabatereine, N.B., Gabrielli, A.F., Rudge, J.W., Fenwick, A., Sacko, M., Dembele, R., Lwambo, N.J.T., Tchuente, L.A., Rollinson, D., Webster, J.P., 2013. Population genetic structure of *Schistosoma mansoni* and *Schistosoma haematobium* from across six sub-Saharan African countries: implications for epidemiology, evolution and control. Acta Trop. 128, 261–274.
- Gower, C.M., Shrivastava, J., Lamberton, P.H.L., Rollinson, D., Webster, B.L., Emery, A., Kabatereine, N.B., Webster, J.P., 2007. Development and application of an ethically and epidemiologically advantageous assay for the multi-locus microsatellite analysis of *Schistosoma mansoni*. Parasitology 134, 523–536.
- Greenberg, R.M., 2013. New approaches for understanding mechanisms of drug resistance in schistosomes. Parasitology 140, 1534–1546.
- Grossman, S.R., Shlyakhter, I., Karlsson, E.K., Byrne, E.H., Morales, S., Frieden, G., Hostetter, E., Angelino, E., Garber, M., Zuk, O., Lander, E.S., Schaffner, S.F., Sabeti, P.C., 2010. A composite of multiple signals distinguishes causal variants in regions of positive selection. Science 327, 883–886.
- Gryseels, B., Polman, K., Clerinx, J., Kestens, L., 2006. Human schistosomiasis. Lancet 368, 1106–1118.

- Gupta, S., Maiden, M.C., Feavers, I.M., Nee, S., May, R.M., Anderson, R.M., 1996. The maintenance of strain structure in populations of recombining infectious agents. Nat. Med. 2, 437–442.
- Gurarie, D., King, C.H., 2005. Heterogeneous model of schistosomiasis transmission and long-term control: the combined influence of spatial variation and age-dependent factors on optimal allocation of drug therapy. Parasitology 130, 49–65.
- Hamelin, F.M., Castel, M., Poggi, S., Andrivon, D., Mailleret, L., 2011. Seasonality and the evolutionary divergence of plant parasites. Ecology 92, 2159–2166.
- Harris, S.R., Feil, E.J., Holden, M.T., Quail, M.A., Nickerson, E.K., Chantratita, N., Gardete, S., Tavares, A., Day, N., Lindsay, J.A., Edgeworth, J.D., De Lencastre, H., Parkhill, J., Peacock, S.J., Bentley, S.D., 2010. Evolution of MRSA during hospital transmission and intercontinental spread. Science 327, 469–474.
- Hayton, K., Su, X.Z., 2008. Drug resistance and genetic mapping in *Plasmodium falciparum*. Curr. Genet. 54, 223–239.
- He, Y.X., Salafsky, B., Ramaswamy, K., 2001. Host-parasite relationships of *Schistosoma japonicum* in mammalian hosts. Trends Parasitol. 17, 320-324.
- Holroyd, N., Sanchez-Flores, A., 2012. Producing parasitic helminth reference and draft genomes at the Wellcome Trust Sanger Institute. Parasite Immunol. 34, 100–107.
- Hotez, P.J., Pecoul, B., 2010. 'Manifesto' for advancing the control and elimination of neglected tropical diseases. PLoS Negl. Trop. Dis. 4, e718.
- Huyse, T., Van den Broeck, F., Jombart, T., Webster, B.L., Diaw, O., Volckaert, F.A., Balloux, F., Rollinson, D., Polman, K., 2013. Regular treatments of praziquantel do not impact on the genetic make-up of *Schistosoma mansoni* in Northern Senegal. Infect. Genet. Evol. 18, 100–105.
- Huyse, T., Webster, B.L., Geldof, S., Stothard, J.R., Diaw, O.T., Polman, K., Rollinson, D., 2009. Bidirectional introgressive hybridization between a cattle and human schistosome species. PLoS Pathog. 5, e1000571.
- Jones, A.G., Ardren, W.R., 2003. Methods of parentage analysis in natural populations. Mol. Ecol. 12, 2511–2523.
- Jost, L.O.U., 2008. GST and its relatives do not measure differentiation. Mol. Ecol. 17, 4015-4026.
- Kao, R.R., Haydon, D.T., Lycett, S.J., Murcia, P.R., 2014. Supersize me: how wholegenome sequencing and big data are transforming epidemiology. Trends Microbiol. 22, 282–291.
- Kaplan, R.M., Vidyashankar, A.N., 2012. An inconvenient truth: global worming and anthelmintic resistance. Veterinary Parasitol. 186, 70–78.
- Katz, N., Chaves, A., Pellegrino, J., 1972. A simple device for quantitative stool thicksmear technique in Schistosomiasis mansoni. Rev. do Inst. Med. Trop. São Paulo 14, 397–400.
- Keeling, M.J., Rand, D.A., Morris, A.J., 1997. Correlation models for childhood epidemics. Proc. Biol. Sci./R. Soc. 264, 1149–1156.
- Kim, Y., Escalante, A.A., Schneider, K.A., 2014. A population genetic model for the initial spread of partially resistant malaria parasites under anti-malarial combination therapy and weak intrahost competition. PLoS One 9, e101601.
- Klepac, P., Metcalf, C.J., Mclean, A.R., Hampson, K., 2013. Towards the endgame and beyond: complexities and challenges for the elimination of infectious diseases. Philos. Trans. R. Soc. Lond. Ser. B, Biol. Sci. 368, 20120137.
- Koukounari, A., Donnelly, C.A., Moustaki, I., Tukahebwa, E.M., Kabatereine, N.B., Wilson, S., Webster, J.P., Deelder, A.M., Vennervald, B.J., Van Dam, G.J., 2013. A latent Markov modelling approach to the evaluation of circulating cathodic antigen strips for schistosomiasis diagnosis pre- and post-praziquantel treatment in Uganda. PLoS Comput. Biol. 9, e1003402.

- Kruger, F.J., 1990. Frequency and possible consequences of hybridization between *Schistosoma haematobium* and *S. mattheei* in the Eastern Transvaal Lowveld. J. Helminthol. 64, 333–336.
- Lamberton, P.H., Kabatereine, N.B., Oguttu, D.W., Fenwick, A., Webster, J.P., 2014. Sensitivity and specificity of multiple Kato-Katz thick smears and a circulating cathodic antigen test for *Schistosoma mansoni* diagnosis pre- and post-repeated-praziquantel treatment. PLoS Negl. Trop. Dis. 8, e3139.
- Lamberton, P.H.L., Hogan, S.C., Kabatereine, N.B., Fenwick, A., Webster, J.P., 2010. In vitro praziquantel test capable of detecting reduced in vivo efficacy in *Schistosoma mansoni* human infections. Am. J. Trop. Med. Hyg. 83, 1340–1347.
- Lammie, P.J., Fenwick, A., Utzinger, J., 2006. A blueprint for success: integration of neglected tropical disease control programmes. Trends Parasitol. 22, 313–321.
- Laxminarayan, R., Klugman, K.P., 2011. Communicating trends in resistance using a drug resistance index. BMJ Open 1, e000135.
- Lelo, A.E., Mburu, D.N., Magoma, G.N., Mungai, B.N., Kihara, J.H., Mwangi, I.N., Maina, G.M., Kinuthia, J.M., Mutuku, M.W., Loker, E.S., Mkoji, G.M., Steinauer, M.L., 2014. No apparent reduction in schistosome burden or genetic diversity following four years of school-based mass drug administration in mwea, central kenya, a heavy transmission area. PLoS Negl. Trop. Dis. 8, e3221.
- Levin, S.A., 1992. Mathematics and Biology: The Interface. Lawrence Berkeley Laboratory, University of California, Berkeley, CA. Available: http://www.bio.vu.nl/nvtb/ Contents.html (accessed 30.10.14).
- Levin, S.A., Grenfell, B., Hastings, A., Perelson, A.S., 1997. Mathematical and computational challenges in population biology and ecosystems science. Science 275, 334–343.
- Liang, Y.S., Coles, G.C., Doenhoff, M.J., Southgate, V.R., 2001. In vitro responses of praziquantel-resistant and -susceptible *Schistosoma mansoni* to praziquantel. Int. J. Parasitol. 31, 1227–1235.
- Lietman, T.M., Gebre, T., Ayele, B., Ray, K.J., Maher, M.C., See, C.W., Emerson, P.M., Porco, T.C., Group, T.S., 2011. The epidemiological dynamics of infectious trachoma may facilitate elimination. Epidemics 3, 119–124.
- Lu, D.B., Rudge, J.W., Wang, T.P., Donnelly, C.A., Fang, G.R., Webster, J.P., 2010. Transmission of *Schistosoma japonicum* in marshland and hilly regions of China: parasite population genetic and sibship structure. PLoS Negl. Trop. Dis. 4, e781.
- Luikart, G., England, P.R., Tallmon, D., Jordan, S., Taberlet, P., 2003. The power and promise of population genomics: from genotyping to genome typing. Nat. Rev. Genet. 4, 981–994.
- Luz, P.M., Vanni, T., Medlock, J., Paltiel, A.D., Galvani, A.P., 2011. Dengue vector control strategies in an urban setting: an economic modelling assessment. Lancet 377, 1673–1680.
- Lynch, C., Roper, C., 2011. The transit phase of migration: circulation of malaria and its multidrug-resistant forms in Africa. PLoS Med. 8, e1001040.
- Mather, A.E., Reid, S.W., Maskell, D.J., Parkhill, J., Fookes, M.C., Harris, S.R., Brown, D.J., Coia, J.E., Mulvey, M.R., Gilmour, M.W., Petrovska, L., De Pinna, E., Kuroda, M., Akiba, M., Izumiya, H., Connor, T.R., Suchard, M.A., Lemey, P., Mellor, D.J., Haydon, D.T., Thomson, N.R., 2013. Distinguishable epidemics of multidrug-resistant *Salmonella typhimurium* DT104 in different hosts. Science 341, 1514–1517.
- Mcmanus, D.P., Gray, D.J., Li, Y., Feng, Z., Williams, G.M., Stewart, D., Rey-Ladino, J., Ross, A.G., 2010. Schistosomiasis in the People's Republic of China: the era of the Three Gorges Dam. Clin. Microbiol. Rev. 23, 442–466.
- Medley, G., Anderson, R.M., 1985. Density-dependent fecundity in *Schistosoma mansoni* infections in man. Trans. R. Soc. Trop. Med. Hyg. 79, 532–534.
- Nair, S., Willaims, J.T., Brockman, A., Paiphum, L., Mayxay, M., Newton, P.N., Guthmann, J.-P., Smithuis, F.M., Hien, T.T., White, N.J., Nosten, F.,

Anderson, T.J.C., 2003. A selective sweep driven by pyrimethamine treatment in southeast asian malaria parasites. Mol. Biol. Evol. 20, 1526–1536.

- Nee, S., Holmes, E.C., May, R.M., Harvey, P.H., 1994. Extinction rates can be estimated from molecular phylogenies. Philos. Trans. R. Soc. Lond. Ser. B, Biol. Sci. 344, 77–82.
- Nkhoma, S.C., Nair, S., Al-Saai, S., Ashley, E., Mcgready, R., Phyo, A.P., Nosten, F., Anderson, T.J., 2013. Population genetic correlates of declining transmission in a human pathogen. Mol. Ecol. 22, 273–285.
- Norton, A.J., Gower, C.M., Lamberton, P.H., Webster, B.L., Lwambo, N.J., Blair, L., Fenwick, A., Webster, J.P., 2010. Genetic consequences of mass human chemotherapy for *Schistosoma mansoni*: population structure pre- and post-praziquantel treatment in Tanzania. Am. J. Trop. Med. Hyg. 83, 951–957.
- Ntd\_Modelling\_Consortium. Manta Ray Media. Available: http://www.ntdmodelling.org/ (accessed 30.10.14).
- Oleksyk, T.K., Smith, M.W., O'brien, S.J., 2010. Genome-wide scans for footprints of natural selection. Philos. Trans. R. Soc. Lond. Ser. B, Biol. Sci. 365, 185–205.
- Ou, C.Y., Ciesielski, C.A., Myers, G., Bandea, C.I., Luo, C.C., Korber, B.T., Mullins, J.I., Schochetman, G., Berkelman, R.L., Economou, A.N., Et, A.L., 1992. Molecular epidemiology of HIV transmission in a dental practice. Science 256, 1165–1171.
- Pampoulie, C., Ruzzante, D.E., Chosson, V., Jörundsdóttir, T.D., Taylor, L., Thorsteinsson, V., Daníelsdóttir, A.K., Marteinsdóttir, G., 2006. The genetic structure of Atlantic cod (*Gadus morhua*) around Iceland: insight from microsatellites, the PanI locus, and tagging experiments. Can. J. Fish. Aquat. Sci. 63, 2660–2674.
- Parkhill, J., 2013. What has high-throughput sequencing ever done for us? Nat. Rev. Microbiol. 11, 664–665.
- Paterson, S., Viney, M.E., 2000. The interface between epidemiology and population genetics. Parasitol. Today 16, 528–532.
- Pearce, R.J., Pota, H., Evehe, M.S., Ba El, H., Mombo-Ngoma, G., Malisa, A.L., Ord, R., Inojosa, W., Matondo, A., Diallo, D.A., Mbacham, W., Van Den Broek, I.V., Swarthout, T.D., Getachew, A., Dejene, S., Grobusch, M.P., Njie, F., Dunyo, S., Kweku, M., Owusu-Agyei, S., Chandramohan, D., Bonnet, M., Guthmann, J.P., Clarke, S., Barnes, K.I., Streat, E., Katokele, S.T., Uusiku, P., Agboghoroma, C.O., Elegba, O.Y., Cisse, B., Ie, A.E., Giha, H.A., Kachur, S.P., Lynch, C., Rwakimari, J.B., Chanda, P., Hawela, M., Sharp, B., Naidoo, I., Roper, C., 2009. Multiple origins and regional dispersal of resistant dhps in African *Plasmodium falciparum* malaria. PLoS Med. 6, e1000055.
- Pindolia, D.K., Garcia, A.J., Huang, Z., Smith, D.L., Alegana, V.A., Noor, A.M., Snow, R.W., Tatem, A.J., 2013. The demographics of human and malaria movement and migration patterns in East Africa. Malar. J. 12, 397.
- Plaisier, A.P., Alley, E.S., Van Oortmarssen, G.J., Boatin, B.A., Habbema, J.D.F., 1997. Required duration of combined annual ivermectin treatment and vector control in the Onchocerciasis Control Programme in West Africa. Bull. World Health Organ. 75, 237–245.
- Protasio, A.V., Dunne, D.W., Berriman, M., 2013. Comparative study of transcriptome profiles of mechanical- and skin-transformed *Schistosoma mansoni* schistosomula. PLoS Negl. Trop. Dis. 7, e2091.
- Protasio, A.V., Tsai, I.J., Babbage, A., Nichol, S., Hunt, M., Aslett, M.A., De Silva, N., Velarde, G.S., Anderson, T.J., Clark, R.C., Davidson, C., Dillon, G.P., Holroyd, N.E., Loverde, P.T., Lloyd, C., Mcquillan, J., Oliveira, G., Otto, T.D., Parker-Manuel, S.J., Quail, M.A., Wilson, R.A., Zerlotini, A., Dunne, D.W., Berriman, M., 2012. A systematically improved high quality genome and

transcriptome of the human blood fluke *Schistosoma mansoni*. PLoS Negl. Trop. Dis. 6, e1455.

- Prugnolle, F., de Meeûs, T., Durand, P., Sire, C., Théron, A., 2002. Sex-specific genetic structure in *Schistosoma mansoni*: evolutionary and epidemiological implications. Mol. Ecol. 11, 1231–1238.
- Prugnolle, F., Liu, H., de Meeûs, T., Balloux, F., 2005a. Population genetics of complex lifecycle parasites: an illustration with trematodes. Int. J. Parasitol. 35, 255–263.
- Prugnolle, F., Roze, D., Théron, A., de Meeûs, T., 2005b. F-statistics under alternation of sexual and asexual reproduction: a model and data from schistosomes (platyhelminth parasites). Mol. Ecol. 14, 1355–1365.
- Prugnolle, F., Théron, A., Pointier, J.P., Jabbour-Zahab, R., Jarne, P., Durand, P., de Meeûs, T., 2005c. Dispersal in a parasitic worm and its two hosts: consequence for local adaptation. Evolution 59, 296–303.
- Rascalou, G., Gourbiere, S., 2014. Competition, virulence, host body mass and the diversification of macro-parasites. J. R. Soc. Interface 11, 20131108.
- Resik, S., Lemey, P., Ping, L.H., Kouri, V., Joanes, J., Perez, J., Vandamme, A.M., Swanstrom, R., 2007. Limitations to contact tracing and phylogenetic analysis in establishing HIV type 1 transmission networks in Cuba. AIDS Res. Hum. Retroviruses 23, 347–356.
- Riley, S., Carabin, H., Belisle, P., Joseph, L., Tallo, V., Balolong, E., Willingham, A.L., Fernandez, T.J., Gonzales, R.O., Olveda, R., Mcgarvey, S.T., 2008. Multi-host transmission dynamics of *Schistosoma japonicum* in Samar province, the Philippines. PLoS Med. 5, e18.
- Rivers, C.M., Lofgren, E.T., Marathe, M., Eubank, S., Lewis, B.L., 2014. Modeling the impact of interventions on an epidemic of Ebola in Sierra Leone and Liberia. PLoS Curr. Outbreaks 1.
- Rollinson, D., Knopp, S., Levitz, S., Stothard, J.R., Tchuem Tchuente, L.A., Garba, A., Mohammed, K.A., Schur, N., Person, B., Colley, D.G., Utzinger, J., 2013. Time to set the agenda for schistosomiasis elimination. Acta Trop. 128, 423–440.
- Rollinson, D., Webster, J.P., Webster, B.L., Nyakaana, S., Jørgensen, A., Stothard, J.R., 2009. Genetic diversity of schistosomes and snails: implications for control. Parasitology 136, 1801–1811.
- Rudge, J.W., Lu, D.B., Fang, G.R., Wang, T.P., Basanez, M.G., Webster, J.P., 2009. Parasite genetic differentiation by habitat type and host species: molecular epidemiology of *Schistosoma japonicum* in hilly and marshland areas of Anhui Province, China. Mol. Ecol. 18, 2134–2147.
- Rudge, J.W., Webster, J.P., Lu, D.B., Wang, T.P., Fang, G.R., Basáñez, M.G., 2013. Identifying host species driving transmission of schistosomiasis japonica, a multi-host parasite system, in China. Proc. Natl. Acad. Sci. U.S.A. 110, 11457–11462.
- Sabeti, P.C., Varilly, P., Fry, B., Lohmueller, J., Hostetter, E., Cotsapas, C., Xie, X., Byrne, E.H., Mccarroll, S.A., Gaudet, R., Schaffner, S.F., Lander, E.S., International Hapmap, C., Frazer, K.A., Ballinger, D.G., Cox, D.R., Hinds, D.A., Stuve, L.L., Gibbs, R.A., Belmont, J.W., Boudreau, A., Hardenbol, P., Leal, S.M., Pasternak, S., Wheeler, D.A., Willis, T.D., Yu, F., Yang, H., Zeng, C., Gao, Y., Hu, H., Hu, W., Li, C., Lin, W., Liu, S., Pan, H., Tang, X., Wang, J., Wang, W., Yu, J., Zhang, B., Zhang, Q., Zhao, H., Zhao, H., Zhou, J., Gabriel, S.B., Barry, R., Blumenstiel, B., Camargo, A., Defelice, M., Faggart, M., Goyette, M., Gupta, S., Moore, J., Nguyen, H., Onofrio, R.C., Parkin, M., Roy, J., Stahl, E., Winchester, E., Ziaugra, L., Altshuler, D., Shen, Y., Yao, Z., Huang, W., Chu, X., He, Y., Jin, L., Liu, Y., Shen, Y., Sun, W., Wang, H., Wang, Y., Wang, Y., Xiong, X., Xu, L., Waye, M.M., Tsui, S.K., Xue, H., Wong, J.T., Galver, L.M., Fan, J.B., Gunderson, K., Murray, S.S., Oliphant, A.R., Chee, M.S., Montpetit, A.,

Chagnon, F., Ferretti, V., Leboeuf, M., Olivier, J.F., Phillips, M.S., Roumy, S., Sallee, C., Verner, A., Hudson, T.J., Kwok, P.Y., Cai, D., Koboldt, D.C., Miller, R.D., et al., 2007. Genome-wide detection and characterization of positive selection in human populations. Nature 449, 913–918.

- Sanchez, C.P., Mayer, S., Nurhasanah, A., Stein, W.D., Lanzer, M., 2011. Genetic linkage analyses redefine the roles of PfCRT and PfMDR1 in drug accumulation and susceptibility in *Plasmodium falciparum*. Mol. Microbiol. 82, 865–878.
- Schistosoma Japonicum Genome, S. & Functional Analysis, C, 2009. The *Schistosoma japonicum* genome reveals features of host-parasite interplay. Nature 460, 345–351.
- Smith, G., Grenfell, B.T., Isham, V., Cornell, S., 1999. Anthelmintic resistance revisited: under-dosing, chemoprophylactic strategies, and mating probabilities. Int. J. Parasitol. 29, 77–91 discussion 93–94.
- Smith, J.M., Haigh, J., 1974. The hitch-hiking effect of a favourable gene. Genet. Res. 23, 23–35.
- Stack, J.C., Murcia, P.R., Grenfell, B.T., Wood, J.L., Holmes, E.C., 2013. Inferring the inter-host transmission of influenza A virus using patterns of intra-host genetic variation. Proc. R. Soc. B. Biol. Sci. 280, 20122173.
- Steinauer, M.L., Blouin, M.S., Criscione, C.D., 2010. Applying evolutionary genetics to schistosome epidemiology. Infect. Genet. Evol. 10, 433-443.
- Steinauer, M.L., Christie, M.R., Blouin, M.S., Agola, L.E., Mwangi, I.N., Maina, G.M., Mutuku, M.W., Kinuthia, J.M., Mkoji, G.M., Loker, E.S., 2013. Non-invasive sampling of schistosomes from humans requires correcting for family structure. PLoS Negl. Trop. Dis. 7, e2456.
- Steinauer, M.L., Hanelt, B., Mwangi, I.N., Maina, G.M., Agola, L.E., Kinuthia, J.M., Mutuku, M.W., Mungai, B.N., Wilson, W.D., Mkoji, G.M., Loker, E.S., 2008. Introgressive hybridization of human and rodent schistosome parasites in western Kenya. Mol. Ecol. 17, 5062–5074.
- Steinmann, P., Keiser, J., Bos, R., Tanner, M., Utzinger, J., 2006. Schistosomiasis and water resources development: systematic review, meta-analysis, and estimates of people at risk. Lancet Infect. Dis. 6, 411–425.
- Stukenbrock, E.H., Christiansen, F.B., Hansen, T.T., Dutheil, J.Y., Schierup, M.H., 2012. Fusion of two divergent fungal individuals led to the recent emergence of a unique widespread pathogen species. Proc. Natl. Acad. Sci. U.S.A. 109, 10954–10959.
- Takala-Harrison, S., Clark, T.G., Jacob, C.G., Cummings, M.P., Miotto, O., Dondorp, A.M., Fukuda, M.M., Nosten, F., Noedl, H., Imwong, M., Bethell, D., Se, Y., Lon, C., Tyner, S.D., Saunders, D.L., Socheat, D., Ariey, F., Phyo, A.P., Starzengruber, P., Fuehrer, H.P., Swoboda, P., Stepniewska, K., Flegg, J., Arze, C., Cerqueira, G.C., Silva, J.C., Ricklefs, S.M., Porcella, S.F., Stephens, R.M., Adams, M., Kenefic, L.J., Campino, S., Auburn, S., Macinnis, B., Kwiatkowski, D.P., Su, X.Z., White, N.J., Ringwald, P., Plowe, C.V., 2013. Genetic loci associated with delayed clearance of *Plasmodium falciparum* following artemisinin treatment in Southeast Asia. Proc. Natl. Acad. Sci. U.S.A. 110, 240–245.
- Taylor, L.H., Latham, S.M., Woolhouse, M.E., 2001. Risk factors for human disease emergence. Philos. Trans. R. Soc. Lond. Ser. B, Biol. Sci. 356, 983–989.
- Tchuem Tchuenté, L.A., Southgate, V.R., Combes, C., Jourdane, J., 1996. Mating behaviour in Schistosomes: are paired worms always faithful? Parasitol. Today 12, 231–236.
- Tchuem Tchuenté, L.A., Southgate, V.R., Imbert-Establet, D., Jourdane, J., 1995. Change of mate and mating competition between males of *Schistosoma intercalatum* and *S. mansoni*. Parasitology 110 (Pt 1), 45–52.
- Tsai, I.J., Zarowiecki, M., Holroyd, N., Garciarrubio, A., Sanchez-Flores, A., Brooks, K.L., Tracey, A., Bobes, R.J., Fragoso, G., Sciutto, E., Aslett, M., Beasley, H., Bennett, H.M.,

Cai, J., Camicia, F., Clark, R., Cucher, M., De Silva, N., Day, T.A., Deplazes, P., Estrada, K., Fernandez, C., Holland, P.W., Hou, J., Hu, S., Huckvale, T., Hung, S.S., Kamenetzky, L., Keane, J.A., Kiss, F., Koziol, U., Lambert, O., Liu, K., Luo, X., Luo, Y., Macchiaroli, N., Nichol, S., Paps, J., Parkinson, J., Pouchkina-Stantcheva, N., Riddiford, N., Rosenzvit, M., Salinas, G., Wasmuth, J.D., Zamanian, M., Zheng, Y., Taenia Solium Genome, C., Cai, X., Soberon, X., Olson, P.D., Laclette, J.P., Brehm, K., Berriman, M., 2013. The genomes of four tape-worm species reveal adaptations to parasitism. Nature 496, 57–63.

- Turner, H.C., Churcher, T.S., Walker, M., Osei-Atweneboana, M.Y., Prichard, R.K., Basáñez, M.G., 2013. Uncertainty surrounding projections of the long-term impact of ivermectin treatment on human onchocerciasis. PLoS Negl. Trop. Dis. 7, e2169.
- Turner, H.C., Walker, M., Churcher, T.S., Basanez, M.G., 2014. Modelling the impact of ivermectin on River Blindness and its burden of morbidity and mortality in African Savannah: EpiOncho projections. Parasit. Vectors 7, 241.
- Valentim, C.L., Cioli, D., Chevalier, F.D., Cao, X., Taylor, A.B., Holloway, S.P., Pica-Mattoccia, L., Guidi, A., Basso, A., Tsai, I.J., Berriman, M., Carvalho-Queiroz, C., Almeida, M., Aguilar, H., Frantz, D.E., Hart, P.J., Loverde, P.T., Anderson, T.J., 2013. Genetic and molecular basis of drug resistance and species-specific drug action in schistosome parasites. Science 342, 1385–1389.
- Vitti, J.J., Grossman, S.R., Sabeti, P.C., 2013. Detecting natural selection in genomic data. Annu. Rev. Genet. 47, 97–120.
- Volkman, S.K., Neafsey, D.E., Schaffner, S.F., Park, D.J., Wirth, D.F., 2012. Harnessing genomics and genome biology to understand malaria biology. Nat. Rev. Genet. 13, 315–328.
- Wang, L., Utzinger, J., Zhou, X.N., 2008. Schistosomiasis control: experiences and lessons from China. Lancet 372, 1793–1795.
- Webster, B.L., Diaw, O.T., Seye, M.M., Webster, J.P., Rollinson, D., 2013. Introgressive hybridization of *Schistosoma haematobium* group species in Senegal: species barrier break down between ruminant and human schistosomes. PLoS Negl. Trop. Dis. 7, e2110.
- Webster, J.P., Molyneux, D., Hotez, P., Fenwick, A., 2014. The contribution of mass drug administration to global health – past, present and future. Philos. Trans. R. Soc. Lond. Ser. B, Biol. Sci. 369, 1471–2970.
- Webster, J.P., Norton, A.J., Gower, C.M., 2008. Evolutionary concepts in predicting and evaluating the impact of mass chemotherapy schistosomiasis control programmes on parasites and their hosts. Evol. Appl. 1, 66–83.
- Webster, J.P., Shrivastava, J., Johnson, P.J., Blair, L., 2007. Is host-schistosome coevolution going anywhere? BMC Evol. Biol. 7, 91.
- Weir, B.S., Cockerham, C.C., 1984. Estimating F-statistics for the analysis of population structure. Evolution 38, 1358–1370.
- WHO, 2012. Accelarating Work to Overcome the Global Impact of Neglected Tropical Diseases – A Roadmap for Implementation (Online). http://www.who.int/ neglected\_diseases/resources/en/index.html.
- World Health Organization, 2013. Schistosomiasis. Progress report 2001–2011 and strategic plan 2012–2020. Available: www.who.int/iris/bitstream/10665/78074/1/ 9789241503174\_eng.pdf, accessed: 15 January 2015.
- Wolstenholme, A.J., Fairweather, I., Prichard, R., Von Samson-Himmelstjerna, G., Sangster, N.C., 2004. Drug resistance in veterinary helminths. Trends Parasitol. 20, 469–476.
- Wootton, J.C., Feng, X., Ferdig, M.T., Cooper, R.A., Mu, J., Baruch, D.I., Magill, A.J., Su, X.Z., 2002. Genetic diversity and chloroquine selective sweeps in *Plasmodium falciparum*. Nature 418, 320–323.
- WTSI. http://www.sanger.ac.uk/research/initiatives/globalhealth/research/helminthgenomes/.

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- Xu, D., Curtis, J., Feng, Z., Minchella, D.J., 2006. On the role of schistosome mating structure in the maintenance of drug-resistant strains. Bull. Math. Biol. 68, 209–229.
- Young, N.D., Jex, A.R., Li, B., Liu, S., Yang, L., Xiong, Z., Li, Y., Cantacessi, C., Hall, R.S., Xu, X., Chen, F., Wu, X., Zerlotini, A., Oliveira, G., Hofmann, A., Zhang, G., Fang, X., Kang, Y., Campbell, B.E., Loukas, A., Ranganathan, S., Rollinson, D., Rinaldi, G., Brindley, P.J., Yang, H., Wang, J., Wang, J., Gasser, R.B., 2012. Whole-genome sequence of *Schistosoma haematobium*. Nat. Genet. 44, 221–225.
- Zerlotini, A., Aguiar, E.R., Yu, F., Xu, H., Li, Y., Young, N.D., Gasser, R.B., Protasio, A.V., Berriman, M., Roos, D.S., Kissinger, J.C., Oliveira, G., 2013. SchistoDB: an updated genome resource for the three key schistosomes of humans. Nucleic Acids Res. 41, D728–D731.
- Zhang, H., Li, D., Zhao, L., Fleming, J., Lin, N., Wang, T., Liu, Z., Li, C., Galwey, N., Deng, J., Zhou, Y., Zhu, Y., Gao, Y., Wang, T., Wang, S., Huang, Y., Wang, M., Zhong, Q., Zhou, L., Chen, T., Zhou, J., Yang, R., Zhu, G., Hang, H., Zhang, J., Li, F., Wan, K., Wang, J., Zhang, X.E., Bi, L., 2013. Genome sequencing of 161 *Mycobacterium tuberculosis* isolates from China identifies genes and intergenic regions associated with drug resistance. Nat. Genet. 45, 1255–1260.
- Zhang, J., Lietman, T., Olinger, L., Miao, Y., Stephens, R.S., 2004. Genetic diversity of *Chlamydia trachomatis* and the prevalence of trachoma. Pediatr. Infect. Dis. J. 23, 217–220.