ORIGINAL ARTICLE OPEN ACCESS 🕕

Discovery of Knock-Down Resistance in the Major African Malaria Vector Anopheles funestus

Joel O. Odero^{1,2} \bigcirc | Tristan P. W. Dennis³ | Brian Polo⁴ | Joachim Nwezeobi⁵ | Marilou Boddé⁵ | Sanjay C. Nagi³ \bigcirc | Anastasia Hernandez-Koutoucheva⁵ | Ismail H. Nambunga¹ | Hamis Bwanary¹ | Gustav Mkandawile¹ | Nicodem J. Govella¹ | Emmanuel W. Kaindoa¹ | Heather M. Ferguson² | Eric Ochomo⁴ | Chris S. Clarkson⁵ \bigcirc | Alistair Miles⁵ | Mara K. N. Lawniczak⁵ \bigcirc | David Weetman³ | Francesco Baldini^{1,2} | Fredros O. Okumu^{1,2}

¹Department of Environmental Health and Ecological Sciences, Ifakara Health Institute, Ifakara, Tanzania | ²School of Biodiversity, One Health, and Veterinary Medicine, University of Glasgow, Glasgow, UK | ³Department of Vector Biology, Liverpool School of Tropical Medicine, Liverpool, UK | ⁴Entomology Section, Centre for Global Health Research, Kenya Medical Research Institute, Kisumu, Kenya | ⁵Wellcome Sanger Institute, Hinxton, UK

Correspondence: Joel O. Odero (jodero@ihi.or.tz) | Fredros O. Okumu (fredros@ihi.or.tz)

Received: 19 June 2024 | Revised: 24 August 2024 | Accepted: 16 September 2024

Handling Editor: Kin-Ming (Clement) Tsui

Funding: This study was supported by the funding received from the Bill & Melinda Gates Foundation (grant no. INV-002138) to F.O.O., F.B., H.M.F. Howard Hughes Medical Institute-Gates Foundation International Research Scholar Award (grant no. OPP 1099295) to F.O.O., and the Academy of Medical Sciences Springboard Award (ref: SBF007\100094) to F.B. The findings and conclusions within this publication are those of the authors and do not necessarily reflect positions or policies of the HHMI, the BMGF or the AMSS. The MalariaGEN Vector Observatory is supported by multiple institutes and funders. The Wellcome Trust participation was supported by funding from Wellcome (220540/Z/20/A, 'Wellcome Sanger Institute Quinquennial Review 2021–2026') and the Bill & Melinda Gates Foundation (INV-001927). The Liverpool School of Tropical Medicine's participation was supported by the National Institute of Allergy and Infectious Diseases ([NIAID] R01-AI116811), with additional support from the Medical Research Council (MR/P02520X/1). The latter grant is a UK-funded award and is part of the EDCTP2 programme supported by the European Union. Martin Donnelly is supported by a Royal Society (RSWF\FT\180003). The Pan-African Mosquito Control Association's participation was funded by the Bill and Melinda Gates Foundation (INV-031595).

Keywords: Anopheles funestus | insecticide resistance | knock-down resistance | Tanzania | voltage-gated sodium channel

ABSTRACT

A major insecticide resistance mechanism in insect pests is knock-down resistance (*kdr*) caused by mutations in the voltagegated sodium channel (*Vgsc*) gene. Despite being common in most malaria *Anopheles* vector species, *kdr* mutations have never been observed in *Anopheles funestus*, the principal malaria vector in Eastern and Southern Africa, with resistance mainly being conferred by detoxification enzymes. In a parallel study, we monitored 10 populations of *An. funestus* in Tanzania for insecticide resistance unexpectedly identified resistance to a banned insecticide, DDT, in the Morogoro region. Through whole-genome sequencing of 333 *An. funestus* samples from these populations, we found eight novel amino acid substitutions in the *Vgsc* gene, including the *kdr* variant, L976F (equivalent to L995F in *An. gambiae*), in tight linkage disequilibrium with another (P1842S). The mutants were found only at high frequency in one region and were accompanied by weak signatures of a selective sweep, with a significant decline between 2017 and 2023. Notably, *kdr* L976F was strongly associated with survivorship to exposure to DDT insecticide, while no clear association was noted with a pyrethroid insecticide (deltamethrin). The WHO prequalifies no DDT products for vector control, and the chemical is banned in Tanzania. Widespread DDT contamination and a legacy of extensive

Joel O. Odero and Tristan P. W. Dennis have contributed equally to this work.

David Weetman, Francesco Baldini, and Fredros O. Okumu have equally supervised this work.

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countrywide stockpiles may have selected for this mutation. Continued monitoring is necessary to understand the origin of *kdr* in *An. funestus*, and the threat posed to insecticide-based vector control in Africa.

1 | Introduction

Chemical insecticides are central to the control of agricultural pests and disease vectors, such as mosquitoes. The control of *Anopheles* mosquitoes through the distribution of over 2.9 billion insecticide-treated bed nets (ITNs) has helped avert an estimated 633 million cases of malaria (Bhatt et al. 2015), a disease that still kills 600,000 yearly (WHO 2023a). However, the widespread use of insecticides for agricultural pest and disease vector control also has detrimental consequences, including direct lethal and sub-lethal effects on human and animal health and destabilising effects on ecosystem structure and function (Nicholson et al. 2023; Wurster Jr., Wurster, and Strickland 1965). For example, insecticide exposure is a key stressor affecting the population decline of pollinators, essential for ecosystem health and food production (Nicholson et al. 2023; Douglas et al. 2020).

A key obstacle to sustainable malaria control is the evolutionary arms race between mosquitoes and insecticide-based mosquito control. Strong selection pressures generated by insecticidebased agricultural pest and disease vector control activities have resulted in the independent evolution of a diverse range of mechanisms that confer insecticide resistance (IR) phenotypes in numerous insect species (Hemingway and Ranson 2000). One of the earliest described IR mechanisms was the emergence of kdr, mediated by mutations in the target site of pyrethroid and organochlorine insecticides, located in the voltage-gated sodium channel gene (Vgsc), which play key roles in the transmission of action potentials along neurons and are an essential component of the nervous system (Davies et al. 2007). These kdr-driven resistance phenotypes appeared rapidly after the introduction of the organochlorine dichloro-diphenyl-trichloroethane (DDT) spraying for insect control in the mid-20th century (Busvine 1951) and eventually evolved to confer resistance to pyrethroids (Grigoraki et al. 2021; Reimer et al. 2008), the key ingredient in ITNs-the first line of defence against malaria. In an era of stalling gains in malaria control (WHO 2023a), and concerted efforts both to develop a new generation of ITN and IRS products (Mosha et al. 2024; Accrombessi et al. 2023) and proactively manage the deployment of existing insecticides to maximise efficacy, intensified surveillance, including genomic surveillance (Lucas et al. 2023; Donnelly, Isaacs, and Weetman 2016), of malaria vector populations is critical for providing real-time warning of insecticide resistance emergence.

Resistance to all major insecticide classes is common in *An. funestus* and is primarily mediated through the increased activity of enzymes that bind to and metabolise insecticides (metabolic resistance) (Weedall et al. 2019; Coetzee and Koekemoer 2013). This contrasts with another major vector *An. gambiae* where resistance is mostly conferred by a combination of metabolic and target-site resistance (Hemingway and Ranson 2000). In a previous study, we reported insecticide resistance phenotypes across Tanzania and found that, in the Morogoro region, resistance to DDT was present (Odero et al. 2024).

In this study, we report the findings of phenotypic and genomic surveillance done in Tanzania to understand the evolution and spread of insecticide resistance in Anopheles funestus-the dominant malaria vector in Eastern and Southern Africa (Coetzee and Koekemoer 2013). We report the first discovery of kdr mutations in An. funestus. We discover that, in Tanzanian An. funestus, kdr confers resistance to DDT, but not deltamethrin, despite a complete ban on DDT use for agriculture and vector control in Tanzania since 2008 by the Stockholm Convention (UNEP 2005). We suggest environmental contamination from extensive DDT stockpiles (WorldBank 2012), or unofficial agricultural use, as possible causes. The emergence of kdr, which threatens the control of major crop pests and vectors of disease, such as An. gambiae and Aedes aegypti (Soderlund and Knipple 2003), highlights the potential of chemical insecticide contamination or unofficial use to exert unexpected and potentially harmful impacts on public health.

2 | Materials and Methods

All scripts and Jupyter Notebooks used to analyse genotype and haplotype data and produce figures and tables are available from the GitHub repository: https://github.com/tristanpwd ennis/kdr_funestus_report_2023.

2.1 | Mosquito Collection

Anopheles funestus samples analysed in this study were collected from 10 administrative regions in Tanzania: Dodoma, Kagera, Katavi, Lindi, Morogoro, Mtwara, Mwanza, Pwani, Ruvuma, and Tanga (Figure 1A). The collections were done as part of a countrywide *Anopheles funestus* surveillance project in Tanzania and were subsequently incorporated into the MalariaGEN *Anopheles funestus* genomic surveillance project database (https://www.malariagen.net/projects/anopheles-funes tus-genomic-surveillance-project). Mosquitoes were collected in households between 2017 and 2023 using CDC light traps and mechanical aspirators. They were sorted by sex and taxa and *An. funestus* group mosquitoes were preserved individually in 96-well plates containing 80% ethanol.

2.2 | Whole-Genome Sequencing and Analysis

The samples were processed as part of the *Anopheles funestus* genomics surveillance MalariaGEN Vector Observatory (VObs) project (https://www.malariagen.net/mosquito). Genomic DNA was extracted from individual mosquitoes using DNeasy Blood and Tissue Kits (Qiagen, Germany). A single band confirmed the DNA purity and integrity on 1% agarose gel and a minimum DNA concentration of $20 \text{ ng}/\mu$ L on a Qubit 2.0 fluorometer. Samples that passed quality control were individually whole-genome sequenced commercially at 30X. The sequencing data have been deposited in the European Nucleotide Archive



FIGURE 1 | Legend on next page.

FIGURE1 (A) Map of *An. funestus* collection locations. Points indicate sample collection locations. The point colour indicates the administrative region from which samples were collected. (B): Phenotypic insecticide resistance profile of *An. funestus* to DDT using bioassay data adopted from our recent surveillance (Odero et al. 2024). The colours and the X-axis represent the various regions where the bioassays were conducted, and the error bars are 95% confidence interval. The black and red dotted lines on the Y-axis represent the 98% and 90% mortality thresholds. (C) H12 selection scans of *An. funestus* chromosome 3RL, coloured and windowed by sample collection region (where n > 20—see Table S2). The X-axis indicates the position (in base-pairs (bp)), and the Y-axis indicates the selection statistic H12. The Grey line indicates the location of the *Vgsc* gene. Note Mwanza region is absent from panel (C) as there were too few samples (n < 20) to perform a selection scan.

(https://www.ebi.ac.uk/ena/browser/home) under study number PRJEB2141.

Reads were aligned to the *An. funestus* reference genome AfunGA1 (Ayala et al. 2022) with Burrows-Wheeler Aligner (BWA) version v0.7.15. Indel realignment was performed using Genome Analysis Toolkit (GATK) version 3.7-0 RealignerTargetCreator and IndelRealigner. Single-nucleotide polymorphisms were called using GATK version 3.7-0 UnifiedGenotyper. Genotypes were called for each sample independently, in genotyping mode, given all possible alleles at all genomic sites where the reference base was not 'N'. The aligned sequences in BAM format were stored in the European Nucleotide Archive (study number PRJEB2141).

The identification of high-quality SNPs and haplotypes was conducted using BWA version 0.7.15 and GATK version 3.7-0. Quality control involved the removal of samples with low mean coverage, removing cross-contaminated samples, running PCA to identify and remove population outliers, and sex confirmation by calling the sex of all samples based on the modal coverage ratio between the X chromosome and the autosomal chromosome arm 3R. Full quality control methods are available on the MalariaGEN vector data user guide (https://malariagen.github. io/vector-data/ag3/methods.html).

We used decision-tree filters that identify genomic sites where SNP calling and genotyping are likely to be less reliable. More information on site filters can be found in the MalariaGEN vector data user guide. Genotypes at biallelic SNPs that passed the decision-tree site filtering process were phased into haplo-types using a combination of read-backed and statistical phasing. Read-backed phasing was performed for each sample using WhatsHap version 1.0 (https://whatshap.readthedocs.io/). Statistical phasing was then performed using SHAPEIT4 version 4.2.1 (https://odelaneau.github.io/shapeit4/).

Complete specifications of the haplotype phasing pipeline are available from the malariagen/pipelines GitHub repository (https://github.com/malariagen/pipelines/tree/master/pipel ines/phasing-vector).

2.3 | Identification of SNPs on Vgsc

To identify the *An. funestus Vgsc* gene and the variant that confers target-site resistance, we performed alignments between the *An. gambiae* VGSC transcript AGAP004707-RD in AgamP4.12 gene set from the Ag1000 phase 3 data resource (https://www. malariagen.net/data/ag1000g-phase3-snp) and AFUN2_008728 from the *An. funestus* AfunF1.3 dataset. We extracted singlenucleotide polymorphism (SNPs) altering the amino acid of VGSC protein from the *An. funestus* dataset and computed the allele frequency on the mosquito cohorts defined by the region and year of collection (see Table S1 for per region/year sample numbers). Under selection pressure various alleles are expected to increase in frequency; we therefore filtered out variant alleles with a frequency lower than 5% resulting in a list of eight variant alleles. Multiple sequence alignments of *An. funestus Vgsc* against *An. gambiae* and *M. domestica* were performed using MEGA v11.013 (Kumar et al. 2018).

2.4 | Population Genetic Analyses

We searched for signatures of selective sweeps on the Vgsc gene using the G123 and H12 selection statistics (Harris, Garud, and DeGiorgio 2018; Garud et al. 2015). H12 selection scans were performed on An. funestus genotypes by collection region where sample n > 20 (see Figure 1A and Table S2) using the h12_gwss function in the malariagen_data python API (https://malar iagen.github.io/malariagen-data-python/latest/Af1.html). Linkage disequilibrium (Rogers and Huff's R-squared) (Rogers and Huff 2009) between the 8 Vgsc alleles was calculated using the rogers_huff_r_between in scikit-allel (https://zenodo.org/ record/4759368). Haplotype clustering was performed by performing hierarchical clustering on a Hamming distance matrix, inferred from phased An. funestus haplotypes, using the Scipy library (https://scipy.org/citing-scipy/). Clustering dendrogram and bar plot of amino acid substitutions were plotted using the seaborn library (48).

2.5 | Association of L976F and P1842S Alleles With Insecticide Resistance

Due to difficulties in finding An. funestus immature stages and unsuccessful attempts to get sufficient offspring from wild blood-fed females, we adopted a previously tested approach relying on unfed and non-gravid females of unknown ages for the resistance bioassays (Pinda et al. 2022; Kaindoa et al. 2017). To test for associations between the identified mutations and IR, we exposed wild non-blood-fed An. funestus mosquitoes of unknown ages to standard doses of deltamethrin and DDT insecticides following the WHO tube assays. The bioassays were conducted as part of a countrywide insecticide resistance surveillance in Tanzania (Odero et al. 2024). For each insecticide, we randomly separated phenotypically resistant mosquitoes (i.e., alive 24h post-exposure) and susceptible (i.e., dead 24h post-exposure). For DDT, we had 10 aLive and 10 dead and for deltamethrin 29 alive and 27 dead. DNA was extracted from individual mosquitoes using DNeasy Blood and Tissue kit (Qiagen). The mosquitoes were identified at the species level using speciesspecific primers that can distinguish An. funestus from the other

members of the group (Koekemoer et al. 2002). To establish whether the two kdr variants are associated with insecticide resistance, we designed PCR primers from An. funestus Vgsc (Gene ID: LOC125769886) to amplify domain IIS6 (L976F); kdrL976F FWD 5'-TGTGCGGTGAATGGATCGAA-3' & kdrL976F_REV 5'-CGCTTCAGCGATCTTGTTGG-3', and C-terminal (P1842S) kdrP1842S-FWD 5'-CTACCCGGGAAATTGTGGCT-3' & kdrP1842S REV 5'-TGCCACCATCGTTTCCGTTA-3'. Each 20 µL reaction volume contained 10 µl GoTaq Green Master Mix (Promega, USA), 1µL (0.5µM final concentration) of forward/ reverse primer, 1μ L of DNA, and 7μ L nuclease-free water. The thermocycler conditions were 94°C (5min), 30 cycles of 94°C (1min), 58°C (30s), and 72°C (30s), and a final extension of 72°C 10min. The DNA fragments were separated on a 1% agarose gel, cut, purified using PureLink Quick Gel Extraction Kit (Invitrogen), and commercially Sanger sequenced. Collectively, we sequenced 76 individual mosquitoes: 56 from deltamethrin and the rest from the DDT bioassays. The frequencies of the wild type and mutant alleles were determined and correlated with phenotypes using generalised linear models in R-software v4.1.1.

2.6 | Data Analysis

To determine the phenotypic resistance to DDT and deltamethrin, we calculated the percentage mortality from the bioassays following WHO guidelines (WHO 2022). The details of the modelling approach accounting for potential mortality variabilities due to extrinsic factors and the resistance profiles across Tanzania are outlined in Odero et al. (2024). To explore the genetic association between L976F and P1842S alleles with DDT and deltamethrin resistance phenotype, we used Haploview version 4.1 statistical software (Barrett et al. 2005). Linkage disequilibrium was established by D' and R2 parameters. Genetic association between alleles or haplotypes and the resistance phenotypes were conducted on alleles with allele frequency>0.05 and in Hardy-Weinberg equilibrium. A Chisquare test was performed, and *p*-values were calculated for the allelic and haplotype frequencies in the alive and dead mosquitoes. The odds ratio for statistically associated and marginally significant alleles was calculated by comparing the related alleles with the rest.

3 | Results

As part of an insecticide resistance surveillance study in 10 sites across Tanzania (Odero et al. 2024; Figure 1A), we investigated phenotypic resistance (as measured by mosquito survival 24 h following insecticide exposure) in *An. funestus* to the discriminating doses of DDT, deltamethrin (type II pyrethroid), or deltamethrin together with the piperonyl butoxide (PBO) synergist, which is increasingly used on ITNs (Harris, Garud, and DeGiorgio 2018) to restore susceptibility in pyrethroid-resistant populations in Tanzania. The mosquitoes were phenotypically resistant to deltamethrin in all Tanzanian regions, but PBO ubiquitously restored susceptibility (Odero et al. 2024). Unexpectedly, resistance to DDT was recorded in the Morogoro region (68%, CI 57.8–77.9), but resistance in other locations is also a possibility (Odero et al. 2024; Figure 1B).

To understand the genetic bases of resistance, we analysed whole-genome sequencing (WGS) data from 333 mosquitoes sampled from 10 sites across Tanzania (Figure 1A). We performed genome-wide selection scans (GWSS) with the H12 and G123 statistics (Figures S1 and S2) to test for evidence of selective sweeps in the An. funestus genome associated with known or novel IR loci (Figure 1C); grouping samples by administrative region, including those collected at different time points (see Table S1 for per-group sample numbers). We detected a signal of elevated H12, indicating a possible selective sweep in the region containing the Vgsc gene (Chromosome 3, positions 44,105,643–44,105,644) in samples from the Morogoro region in the southeastern part of the country (Figure 1C). Notably, Vgsc encodes for the voltage-gated sodium channel, where DDT binds in mosquitoes, and where mutations are strongly linked to resistance in An. gambiae (Mosha et al. 2024). In Kagera, Katavi, and Mwanza regions, there was no visible sign of a selective sweep at or near the Vgsc region. In Dodoma, Lindi, Ruvuma, and Tanga, there were peaks of elevated H12 near Vgsc, but these appeared within the context of relatively high H12 across the chromosome (Figure 1C and Figures S1 and S2).

We searched our data for mutations in the Vgsc gene and found 8 amino acid substitutions occurring at frequencies >5% (Figure 2A). Of these, two alleles, L976F and P1842S occurred at the highest frequency (Figure 2A). The frequencies of P1824S and L976F were highest in samples collected from Morogoro in 2017 (0.75 and 0.90 respectively) (Figure 2A) and declined yearly, reaching their lowest frequency in samples collected in 2023 (0.48 and 0.56 respectively; $\chi^2 = 12.15$, p = 0.0005; Figure 2B). These mutations occurred at very low frequencies or were absent in all other locations (Figure 2A). To understand their function, we aligned the An. funestus Vgsc sequence (Gene ID: AFUN2_008728.R15290) with that of Musca domestica (Gene ID: X96668) and An. gambiae (AGAP004707-RD AgamP4.12 gene set) (Clarkson et al. 2021). We found that the amino acid change at An. funestus L976F corresponded to L1014F in M. domestica and L995F in An. gambiae in domain II subunit 6 (IIS6) of the Vgsc gene (Table 1), which in An. gambiae species complex drastically increases IR to DDT and pyrethroids (Reimer et al. 2008; Mitchell et al. 2014). The second variant P1842S corresponded to P1874S in An. gambiae and P1879 in M. domestica and were all in the C-terminal domain (Table 1).

To explore the possible association between L976F and P1842S alleles with DDT and deltamethrin resistance, we genotyped surviving (resistant) and dead (susceptible) mosquitoes from IR bioassays for both L976Fand P1842S loci. Neither locus was associated with deltamethrin resistance: L976F (χ^2 =0.04, *p*=0.84) and P1842S (χ^2 =0.59, *p*=0.44) (Figure 2C). We found a strong association with DDT resistance in mosquitoes carrying L976F (χ^2 =9.23, odds ratio=11.0, *p*=0.0024) and a marginally nonsignificant positive association for P1842S (χ^2 =3.75, *p*=0.0528; Figure 2C).

To elucidate *Vgsc* haplotype structure in *An. funestus*, we computed pairwise linkage disequilibrium (LD) using the Rogers and Huff method (briefly, derived from r, the correlation across unphased genotypic values) (Rogers and Huff 2009), between nonsynonymous variants occurring at a frequency of > 5% in Tanzanian *An. funestus* (Figure 2D). We found that



FIGURE 2 | (A) Heatmap of *Vgsc* allele frequencies. Y-axis labels indicate mutation effect, chromosome position, and nucleotide change. X-axis labels indicate the collection date and heatmap intensity indicates frequency where darker = higher, with frequency labelled in each heatmap facet. The heatmap is panelled by the sample collection region. (B) L976F and 1842S frequencies, in the Morogoro region, over time. The y-axis indicates allele frequency, X-axis indicates the date. Line and point colour refer to mutation, specified in the legend. Bars indicate 95% confidence intervals. (C) Denotes the association of L976F and P1842S with resistance to Deltamethrin and DDT. Colour and panelling are by mutation, the x-axis indicates genotype, the y-axis indicates mortality, the point shape indicates the mean for each insecticide and the line indicates the 95% CI based on generalised mixed model prediction. (D) Heatmap of linkage disequilibrium (LD) (Rogers and Huff R) between nonsynonymous variants in the *Vgsc* gene at frequency > 5%. LD is indicated by fill colour. SNP effects and positions are labelled on the X and Y axes.

TABLE 1 | Comparative non-synonymous nucleotide variation in the voltage-gated sodium channel gene. The position is relative to the *An*. *funestus* strain FUMOZ reference, chromosome arm 3RL. Codon numbering according to *Anopheles funestus Vgsc* transcript AFUN2_008728. R15290, *An. gambiae* transcript AGAP004707-RD in gene set AgamP4.12, and *Musca domestica* EMBL accession X96668 Williamson et al. (1996).

Position	An. funestus	An. gambiae	M. domestica	Domain
3RL:44,115,564T>C	I2030V	I2061	P2063	СООН
3RL:44,115,768 C>A	G1962C	A1994	P1997	СООН
3RL:44,116,128G>A	P1842S	P1874S	P1879	СООН
3RL:44,116,334T>C	N1773S	N1805	N1810	
3RL:44,116,923 A>T	F1638Y	F1670	V1675	
3RL:44,117,167 A>T	W1557R	W1589	W1594	
3RL:44,122,391 C>A	G1144C	G1173	G1180	
3RL:44,125,475T>A	L976F	L995F	L1014	IIS6



kdr haplotype clusters

FIGURE 3 | Clustering of haplotypes at the *Vgsc* gene (LOC125769886, 3RL:44,105,643–44,156,624). The dendrogram branch length corresponds to no. SNPs difference (y-axis). Tips correspond to individual haplotypes (the *x*-axis). The coloured Population bar denotes the administrative region of origin (as described by the legend). Red blocks at the bottom indicate the presence of the labelled non-synonymous SNPs in the *Vgsc* gene.

P1824S occurred in tight LD with L976F (D'=0.95; Figure 2D). Of other non-synonymous polymorphisms, F1638Y and W1557R exhibited only weak LD with L976F (Figure 2D). We

constructed a haplotype clustering dendrogram from haplotypes in all 333 individuals, from the *Vgsc* gene (Figure 3). The clustering dendrogram disclosed three major clades and three main combinations of the four most prevalent *Vgsc* alleles (Figure 3). The most striking signal was a subclade of identical, or near-identical haplotypes containing both L976F and P1842S (Figure 3), indicating a selective sweep on a combined L976F/P1842S haplotype. This combined haplotype was present at higher frequencies in the Morogoro region relative to the neighbouring regions of Pwani, Ruvuma, and Dodoma (Figure 3). Most amino acid substitutions were present in a single clade in samples from Pwani, Dodoma, Ruvuma, and especially Morogoro (Figure 3).

4 | Discussion

In a genomic surveillance study in Tanzanian An. funestus, we discovered eight novel Vgsc mutations. L976F, confers knockdown resistance (kdr), occurring in tight linkage disequilibrium with, P1842S, and at high frequencies (up to 90%) in the Morogoro region over 4 years, with limited spread to neighbouring regions. The mutation L976F showed an association with resistance to DDT, but not to pyrethroid insecticides. The role of *kdr* in pyrethroid resistance phenotypes in other *Aedes*, Culex and Anopheles vectors makes the discovery of kdr in An. funestus a significant and unwelcome development that has the potential to pose a new threat to vector control in the region. Reassuringly, a lack of association between kdr and deltamethrin resistance indicates that the emergence of kdr is not linked to, nor is presently likely to threaten, the mass rollout of PBO-pyrethroid bed nets currently underway in Tanzania as a response to IR (Tanzania-NMCP 2020). The emergence of kdr resistance to DDT suggests that future use of DDT for IRS may become even less favoured. However, this does not preclude a role for kdr in the An. funestus IR armamentarium in the future and an urgent follow-up study is required to monitor the evolution of vector DDT resistance and determine whether kdr confer resistance phenotypes to other widely used pyrethroids, such as permethrin, and alpha-cypermethrin, as well as other insecticide families, especially PBO and pyrrole formulations currently being rolled out in new ITN products across the African continent (WHO 2023b). The lack of association of kdr with pyrethroid resistance might be due to the strong metabolic resistance shown to pyrethroids in An. funestus, reducing the benefit of kdr (Weedall et al. 2019). The association of kdr with resistance to DDT but not pyrethroids, combined with selection signals and recently declining kdr allele frequencies where we have time series, suggests recentpast, rather than contemporary selection, perhaps due to factors other than the current use of public health pesticides.

This discovery raises intriguing questions about the conditions that have enabled the emergence of *kdr* in *An. funestus*. Our data suggests that *Vgsc* mutation in *An. funestus* do not confer target-site resistance to pyrethroids, indicating a possible explanation as to why, despite extreme selection pressures imposed by pyre-throid control have facilitated widespread propagation of resistant *Vgsc* haplotypes across the African continent in *An. gambiae* (Clarkson et al. 2021), the emergence of *kdr* in Tanzanian *An. funestus* remains relatively localised. Mechanistic studies, including expression studies of mutant *Vgsc* proteins in *Xenopus* oocytes (Miller and Zhou 2000), will enable comparisons between taxa that will elucidate this further.

If the ubiquitous use of pyrethroids in vector control did not select for the emergence of kdr, whence kdr? Even more curiously, the apparent decline of kdr allele frequencies between 2017 and 2023 suggests that the selection pressure causing the emergence of kdr has eased (although non-uniform sample sizes per time-point make confident assertion of this difficult). DDT is a largely obsolete, banned, pesticide that is no longer widely used for vector control in Tanzania, or in Africa as a whole, due to its bio-accumulative and toxic propertieswith the most well-known effects being egg-shell thinning properties amongst birds (Grier 1982), and associations with human cancers (Cohn, Cirillo, and Terry 2019). There is no record of DDT use in the last decade for agriculture or vector control in the Morogoro region, or Tanzania as a whole, where the production, importation, and usage of DDT have been banned since 2009 (UNEP n.d.), except for limited use in malaria vector control. In 2008, Tanzania rolled out an ambitious malaria vector control strategy relying on large-scale use of DDT for indoor residual spraying (IRS), implemented in 60 districts across the country (Figure 4A), and discontinued in 2010 (Oxborough 2016). Morogoro, where we detected kdr, was not part of this expanded campaign. Before the ban, Tanzania imported large stockpiles of DDT mostly for agricultural pest control (Figure 4B). Following the ban,



FIGURE 4 \mid (A) Tanzanian National Malaria Control Programme (NMCP) indoor residual spraying strategy 2008–2012. The colours indicate districts where DDT spraying was planned. (B) DDT stockpile locations with the size of the circle indicating the stockpile quantities. (C) Agroecological zones in Tanzania with colours on the map denoting the categories indicated in the figure key.

there have been anecdotal reports of continued illegal use of DDT amongst farmers to date (Lahr et al. 2016). The Africa Stockpiles Programme (ASP) was launched in 2005 to eliminate stockpiles of obsolete pesticides, including DDT. At this time, it was estimated that Tanzania still possessed approx. 1500 t of obsolete pesticides (FAO n.d.), including a DDT stockpile of 30 tons (as of 2012) (WorldBank 2012), approximately 50 km away from where DDT-resistant An. funestus were detected in this study, and 156 tons were in Morogoro town (WorldBank 2012; Figure 4B). The ASP and the Tanzanian Government eliminated 100% of inventoried publicly held DDT stockpiles and conducted extensive environmental remediation by programme closed in 2013 (WorldBank 2016). However, extensive DDT contamination remains (Elibariki and Maguta 2017), and DDT remains in widespread use by private individuals (Lahr et al. 2016). The coincident proximal location of high levels of kdr in An. funestus with large past DDT stockpiles as well as the presence of widespread DDT contamination and private usage leads us to hypothesise that the two most likely scenarios of kdr emergence in An. funestus are contamination of local larval breeding sites from agricultural or stockpiled DDT (Figure 4B,C), and further investigation is needed to establish why kdr did not emerge and sweep through the population during periods of widespread DDT usage in the 20th century. The removal of DDT stockpiles by the ASP, and ongoing environmental remediation, may have contributed to reduced selection pressure on kdr, evident from declining frequency in Morogoro (although small and uneven sample sizes make confident assertion of this trend difficult). Continued monitoring of allele frequencies and future studies of kdr frequencies targeted towards sites of known DDT contamination will establish whether this hypothesis is correct.

In *Silent Spring* (1962), Rachel Carson brought for the first time into the public eye the unpredictable and often remote impacts of anti-insect chemical agents on human health and nature 'On one hand delicate and destructible, on the other miraculously tough and resilient, and capable of striking back in unexpected ways' (Carson 1962). Further study of *kdr* in *An. funestus* will enable the identification of the origin of this mutation and make clear the full implications of its presence in the population for vector control. Whether the emergence of *kdr* in *An. funestus* is caused by vector control, unlicensed DDT usage in agriculture, or exposure to stockpiled DDT, our findings underscore the legacy of *Silent Spring* by reinforcing the potential for pesticides and organic pollutants to exert inadvertent influences on animal biology that may have profound and unfortunate consequences for public health.

Author Contributions

The project was conceived and supervised by F.O.O., F.B., and D.W. Field collection was performed by J.O.O., I.H.N., H.B., and G.M. Laboratory analysis, data acquisition and management, and preparing samples for whole-genome sequencing were performed by J.O.O. Sequence Q.C., alignments, S.N.P. calling, and haplotype phasing were performed by A.H.-K., J.N., C.S.C., and A.M. J.O.O. and T.P.W.D. analysed the data and generated all figures and tables. The manuscript was drafted by J.O.O. and T.P.W.D. and revised by all authors. Throughout the project, all authors have contributed key ideas that have shaped the work and the final paper.

Acknowledgements

The authors express their sincere gratitude to the local authorities, community leaders, and residents of all study villages for their invaluable cooperation and permission to conduct this research. Ethical approvals for this project were obtained from the Ifakara Health Institute's Institutional Review Board (Protocol ID: IHI/IRB/no: 26-2020) and the Medical Research Coordinating Committee (MRCC) at the National Institute for Medical Research (Protocol ID: NIMR/ HQ/R.8a/Vol.IX/3495). We extend our deepest thanks to the National Institute of Medical Research in Tanzania for granting permission to publish this work (Ref. No. BD.242/437/01B/42). This study was supported by the MalariaGEN Vector Observatory which is an international collaboration working to build capacity for malaria vector genomic research and surveillance and involves contributions by the following institutions and teams. Wellcome Sanger Institute: Lee Hart, Kelly Bennett, Anastasia Hernandez-Koutoucheva, Jon Brenas, Menelaos Ioannidis, Chris Clarkson, Alistair Miles, Julia Jeans, Paballo Chauke, Victoria Simpson, Eleanor Drury, Osama Mayet, Sónia Gonçalves, Katherine Figueroa, Tom Maddison, Kevin Howe, Mara Lawniczak; Liverpool School of Tropical Medicine: Eric Lucas, Sanjay Nagi, Martin Donnelly; Broad Institute of Harvard and MIT: Jessica Way, George Grant; Pan-African Mosquito Control Association: Jane Mwangi, Edward Lukyamuzi, Sonia Barasa, Ibra Lujumba, Elijah Juma. The authors would like to thank the staff of the Wellcome Sanger Genomic Surveillance unit and the Wellcome Sanger Institute Sample Logistics, Sequencing, and Informatics facilities for their contributions.

Conflicts of Interest

The authors declare no conflicts of interest.

Data Availability Statement

The whole-genome sequencing data generated in this study have been deposited in the European Nucleotide Archive (https://www.ebi.ac. uk/ena/browser/home) under study number PRJEB2141. The partial Sanger sequence data for L976F and P1842S are available through Github https://github.com/tristanpwdennis/kdr_funestus_report_2023/blob/main/data/kdr_sequenced_sanger.fasta.

Open Research Badges

This article has earned an Open Data badge for making publicly available the digitally-shareable data necessary to reproduce the reported results. The whole genome sequencing data generated in this study have been deposited in the European Nucleotide Archive (https://www.ebi. ac.uk/ena/browser/home) under study number PRJEB2141. All scripts and Jupyter Notebooks used to analyse genotype and haplotype data, and produce figures and tables are available from the GitHub repository: https://github.com/tristanpwdennis/kdr_funestus_report_2023.

Benefit-Sharing Statement

Benefits Generated: A research collaboration was developed with scientists from the countries providing genetic samples, all collaborators are included as co-authors, the results of the research have been shared with the provider communities and the broader scientific community (see above), and the research addresses a priority concern, in this case, the control of organisms being studied. More broadly, our group is committed to international scientific partnerships, as well as institutional capacity building.

References

Accrombessi, M., J. Cook, E. Dangbenon, et al. 2023. "Efficacy of Pyriproxyfen-Pyrethroid Long-Lasting Insecticidal Nets (LLINs) and

Chlorfenapyr-Pyrethroid LLINs Compared With Pyrethroid-Only LLINs for Malaria Control in Benin: A Cluster-Randomised, Superiority Trial." *Lancet* 401, no. 10375: 435–446.

Ayala, D., O. Akone-Ella, P. Kengne, et al. 2022. "The Genome Sequence of the Malaria Mosquito, *Anopheles funestus*, Giles, 1900." *Wellcome Open Research* 7: 287.

Barrett, J. C., B. Fry, J. Maller, and M. J. Daly. 2005. "Haploview: Analysis and Visualization of LD and Haplotype Maps." *Bioinformatics* 21, no. 2: 263–265.

Bhatt, S., D. J. Weiss, E. Cameron, et al. 2015. "The Effect of Malaria Control on Plasmodium Falciparum in Africa Between 2000 and 2015." *Nature* 526, no. 7572: 207–211.

Busvine, J. R. 1951. "Mechanism of Resistance to Insecticide in Houseflies." *Nature* 168, no. 4266: 193–195.

Carson, R. 1962. *Silent Spring: Mariner Books Classics*; Anniversary Edition. Boston, MA: Houghton Mifflin.

Clarkson, C. S., A. Miles, N. J. Harding, et al. 2021. "The Genetic Architecture of Target-Site Resistance to Pyrethroid Insecticides in the African Malaria Vectors *Anopheles gambiae* and *Anopheles coluzzii.*" *Molecular Ecology* 30, no. 21: 5303–5317.

Coetzee, M., and L. L. Koekemoer. 2013. "Molecular Systematics and Insecticide Resistance in the Major African Malaria Vector *Anopheles funestus*." *Annual Review of Entomology* 58: 393–412.

Cohn, B. A., P. M. Cirillo, and M. B. Terry. 2019. "DDT and Breast Cancer: Prospective Study of Induction Time and Susceptibility Windows." *Journal of the National Cancer Institute* 111, no. 8: 803–810.

Davies, T. G., L. M. Field, P. N. Usherwood, and M. S. Williamson. 2007. "A Comparative Study of Voltage-Gated Sodium Channels in the Insecta: Implications for Pyrethroid Resistance in Anopheline and Other Neopteran Species." *Insect Molecular Biology* 16, no. 3: 361–375.

Donnelly, M. J., A. T. Isaacs, and D. Weetman. 2016. "Identification, Validation, and Application of Molecular Diagnostics for Insecticide Resistance in Malaria Vectors." *Trends in Parasitology* 32, no. 3: 197–206.

Douglas, M. R., D. B. Sponsler, E. V. Lonsdorf, and C. M. Grozinger. 2020. "County-Level Analysis Reveals a Rapidly Shifting Landscape of Insecticide Hazard to Honey Bees (*Apis mellifera*) on US Farmland." *Scientific Reports* 10, no. 1: 797.

Elibariki, R., and M. M. Maguta. 2017. "Status of Pesticides Pollution in Tanzania—A Review." *Chemosphere* 178: 154–164.

FAO. n.d. "Prevention and Disposal of Obsolete Pesticides." https:// www.fao.org/agriculture/crops/obsolete-pesticides/where-stocks/afric a-stocks/en/.

Garud, N. R., P. W. Messer, E. O. Buzbas, and D. A. Petrov. 2015. "Recent Selective Sweeps in North American *Drosophila melanogaster* Show Signatures of Soft Sweeps." *PLoS Genetics* 11, no. 2: e1005004.

Grier, J. W. 1982. "Ban of DDT and Subsequent Recovery of Reproduction in Bald Eagles." *Science* 218, no. 4578: 1232–1235.

Grigoraki, L., R. Cowlishaw, T. Nolan, M. Donnelly, G. Lycett, and H. Ranson. 2021. "CRISPR/Cas9 Modified an Gambiae Carrying Kdr Mutation L1014F Functionally Validate Its Contribution in Insecticide Resistance and Combined Effect With Metabolic Enzymes." *PLoS Genetics* 17, no. 7: e1009556.

Harris, A. M., N. R. Garud, and M. DeGiorgio. 2018. "Detection and Classification of Hard and Soft Sweeps From Unphased Genotypes by Multilocus Genotype Identity." *Genetics* 210, no. 4: 1429–1452.

Hemingway, J., and H. Ranson. 2000. "Insecticide Resistance in Insect Vectors of Human Disease." *Annual Review of Entomology* 45: 371–391.

Kaindoa, E. W., N. S. Matowo, H. S. Ngowo, et al. 2017. "Interventions That Effectively Target *Anopheles funestus* Mosquitoes Could Significantly Improve Control of Persistent Malaria Transmission in South-Eastern Tanzania." *PLoS One* 12, no. 5: e0177807.

Koekemoer, L. L., L. Kamau, R. H. Hunt, and M. Coetzee. 2002. "A Cocktail Polymerase Chain Reaction Assay to Identify Members of the *Anopheles funestus* (Diptera: Culicidae) Group." *American Journal of Tropical Medicine and Hygiene* 66, no. 6: 804–811.

Kumar, S., G. Stecher, M. Li, C. Knyaz, and K. Tamura. 2018. "MEGA X: Molecular Evolutionary Genetics Analysis Across Computing Platforms." *Molecular Biology and Evolution* 35, no. 6: 1547–1549.

Lahr, J., R. Buij, F. Katagira, and H. Valk. 2016. "Pesticides in the Southern Agricultural Growth Corridor of Tanzania (SAGCOT): A Scoping Study of Current and Future Use, Associated Risks and Identification of Actions for Risk Mitigation."

Lucas, E. R., S. C. Nagi, A. Egyir-Yawson, et al. 2023. "Genome-Wide Association Studies Reveal Novel Loci Associated With Pyrethroid and Organophosphate Resistance in *Anopheles gambiae* and *Anopheles coluzzii*." *Nature Communications* 14, no. 1: 4946.

Miller, A. J., and J. J. Zhou. 2000. "Xenopus Oocytes as an Expression System for Plant Transporters." *Biochimica et Biophysica Acta* 1465, no. 1: 343–358.

Mitchell, S. N., D. J. Rigden, A. J. Dowd, et al. 2014. "Metabolic and Target-Site Mechanisms Combine to Confer Strong DDT Resistance in *Anopheles gambiae.*" *PLoS One* 9, no. 3: e92662.

Mosha, J. F., N. S. Matowo, M. A. Kulkarni, et al. 2024. "Effectiveness of Long-Lasting Insecticidal Nets With Pyriproxyfen-Pyrethroid, Chlorfenapyr-Pyrethroid, or Piperonyl Butoxide-Pyrethroid Versus Pyrethroid Only Against Malaria in Tanzania: Final-Year Results of a Four-Arm, Single-Blind, Cluster-Randomised Trial." *Lancet Infectious Diseases* 24, no. 1: 87–97.

Nicholson, C. C., J. Knapp, T. Kiljanek, et al. 2023. "Pesticide Use Negatively Affects Bumble Bees Across European Landscapes." *Nature* 628: 355–358.

Odero, J. O., I. H. Nambunga, J. P. Masalu, et al. 2024. "Genetic Markers Associated With the Widespread Insecticide Resistance in Malaria Vector *Anopheles funestus* Populations Across Tanzania." *Parasites & Vectors* 17, no. 1: 230.

Oxborough, R. M. 2016. "Trends in US President's Malaria Initiative-Funded Indoor Residual Spray Coverage and Insecticide Choice in Sub-Saharan Africa (2008–2015): Urgent Need for Affordable, Long-Lasting Insecticides." *Malaria Journal* 15: 146.

Pinda, P. G., D. S. Msaky, L. L. Muyaga, et al. 2022. "Relationships Between Biological Age, Distance From Aquatic Habitats and Pyrethroid Resistance Status of *Anopheles funestus* Mosquitoes in South-Eastern Tanzania." *Malaria Journal* 21, no. 1: 365.

Reimer, L., E. Fondjo, S. Patchoké, et al. 2008. "Relationship Between KDR Mutation and Resistance to Pyrethroid and DDT Insecticides in Natural Populations of Anopheles Gambiae." *Journal of Medical Entomology* 45, no. 2: 260–266.

Rogers, A. R., and C. Huff. 2009. "Linkage Disequilibrium Between Loci With Unknown Phase." *Genetics* 182, no. 3: 839–844.

Soderlund, D. M., and D. C. Knipple. 2003. "The Molecular Biology of Knockdown Resistance to Pyrethroid Insecticides." *Insect Biochemistry and Molecular Biology* 33, no. 6: 563–577.

Tanzania-NMCP. 2020. "Tanzania National Malaria Strategic Plan 2021–2015."

UNEP. 2005. Stockholm Convention on Persistent Organic Pollutants (POPs). Nairobi, Kenya: UNEP.

UNEP. n.d. "National Implementation Plans 2005." https://www.pops. int/Implementation/NationalImplementationPlans/NIPTransmission/ tabid/253/Default.aspx.

Weedall, G. D., L. M. J. Mugenzi, B. D. Menze, et al. 2019. "A Cytochrome P450 Allele Confers Pyrethroid Resistance on a Major African Malaria Vector, Reducing Insecticide-Treated Bednet Efficacy." *Science Translational Medicine* 11, no. 484: eaat7386.

WHO. 2022. "Manual for Monitoring Insecticide Resistance in Mosquito Vectors and Selecting Appropriate Interventions."

WHO. 2023a. "World Malaria Report." https://www.who.int/teams/global-malaria-programme/reports/world-malaria-report-2023.

WHO. 2023b. "Guidelines for Malaria."

Williamson, M. S., D. Martinez-Torres, C. A. Hick, and A. L. Devonshire. 1996. "Identification of Mutations in the Housefly Para-Type Sodium Channel Gene Associated With Knockdown Resistance (Kdr) to Pyrethroid Insecticides." *Molecular and General Genetics* 252, no. 1–2: 51–60.

WorldBank. 2012. "Saying Goodbye to Tanzania's Old Pesticide Stocks: World Bank." https://www.worldbank.org/en/news/feature/2012/09/ 12/saying-goodbye-to-tanzania-s-old-pesticide-stocks.

WorldBank. 2016. "Africa Stockpiles Program Project Performance and Assessment Report." World Bank. https://documents1.worldbank.org/curated/en/168841477341223021/pdf/108524-PPAR-PUBLIC.pdf.

Wurster, C. F., Jr., D. H. Wurster, and W. N. Strickland. 1965. "Bird Mortality After Spraying for Dutch Elm Disease With DDT." *Science* 148, no. 3666: 90–91.

Supporting Information

Additional supporting information can be found online in the Supporting Information section.