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G-quadruplex RNA motifs influence gene expression in the malaria parasite *Plasmodium falciparum*

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**ABSTRACT**

G-quadruplexes are non-helical secondary structures that can fold in vivo in both DNA and RNA. In human cells, they can influence replication, transcription and telomere maintenance in DNA, or translation, transcript processing and stability of RNA. We have previously shown that G-quadruplexes are detectable in the DNA of the malaria parasite *Plasmodium falciparum*, despite a very highly A/T-biased genome with unusually few guanine-rich sequences. Here, we show that RNA G-quadruplexes can also form in *P. falciparum* RNA, using rG4-seq for transcriptome-wide structure-specific RNA probing. Many of the motifs, detected here via the rG4seeker pipeline, have non-canonical forms and would not be predicted by standard *in silico* algorithms. However, *in vitro* biophysical assays verified formation of non-canonical motifs. The G-quadruplexes in the *P. falciparum* transcriptome are frequently clustered in certain genes and associated with regions encoding low-complexity peptide repeats. They are over-represented in particular classes of genes, notably those that encode *PfEMP1* virulence factors, stress response genes and DNA binding proteins. *In vitro* translation experiments and *in vivo* measures of translation efficiency showed that G-quadruplexes can influence the translation of *P. falciparum* mRNAs. Thus, the G-quadruplex is a novel player in post-transcriptional regulation of gene expression in this major human pathogen.

**INTRODUCTION**

Protozoan *Plasmodium* parasites are the causative agents of human malaria, a disease responsible for widespread morbidity and almost half a million deaths each year (1). Most of the deaths are caused by the species *P. falciparum*, which has an unusual genome with an extreme A/T-bias of ~81% A/T (2). Not all *Plasmodium* species share this feature: the five other *Plasmodium* species that infect humans have genomes with A/T contents of ~60%, 61%, 71% and 76% for *P. vivax*, *P. knowlesi*, *P. ovale* and *P. malariae* respectively (3). In *P. falciparum*, however, the particularly A/T-biased genome results in an extreme paucity of guanine-rich sequences, and hence of putative G-quadruplex forming sequences (PQSs) (4,5).

The G-quadruplex is an important non-double-helical structure that can form in DNA and also RNA (6). It is classically formed from four tracts of at least three guanines in close proximity on the same strand: these are arranged as three or more quartets stacked on top of one another (7). The requisite guanine density is a rare feature in A/T-biased genomes, but the existence of G-quadruplexes nevertheless has been predicted in the *P. falciparum* genome by searching for the consensus sequence (G₃ N₄)₄ (4,5,8). Only ~100 PQSs are found outside the inherently-G-rich telomeres: this is approximately one per 300 kb of the non-telomeric genome, compared to an average of one per kb in the human genome (9). More modern algorithms such as *G4Hunter* (10), which can identify PQSs in ‘non-canonical’

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forms beyond the classical (G₃ N₄), can increase the PQS count in the \( P. falciparum \) genome, but only modestly (5,11).

Despite their scarcity, some G-quadruplexes have been shown to fold in \( P. falciparum \) DNA both in vivo (12) and in vitro (5,8,11–13). By contrast, RNA G-quadruplexes (rG4s) have to date remained unexplored in \( P. falciparum \), or in any other organism with a comparable genome bias. Nevertheless, they could have important roles in parasite biology. PQSs in the \( P. falciparum \) genome are primarily found around the major virulence gene family \( var \)—either within the coding sequence or upstream of \( var \) genes (4,5,8). Mitotic recombination amongst these virulence genes is strongly spatially associated with PQSs (4), and the loss of RecQ helicases, which normally act to unwind G-quadruplexes, can increase the rate of \( var \) gene recombination (14). Therefore, one unique role for G-quadruplexes at the DNA level in \( P. falciparum \) is probably to promote \( var \) gene diversification. If these G-quadruplexes also occurred at the RNA level in \( var \) gene transcripts, they could modulate expression at the translational level. Similarly, translation could be affected in non-\( var \) genes that harbour rG4s. It has been suggested that post-transcriptional regulation might be particularly important in \( P. falciparum \) because this organism has unusually low numbers of sequence-specific transcription factors (15,16) and a ‘hardwired’ transcriptional cascade across its cell cycle (17).

In several model organisms, the rG4 content of the transcriptome has recently been investigated by ‘rG4-seq’ (18–20), a technique in which the transcriptome is extracted from cellular RNA, purified and eluted cDNA samples (8) are performed as follows: 0.12 U µl⁻¹ Turbo DNase (Albion) or 5 U RNase A and 20 U RNase T1 (RNase Cocktail enzyme mix, Thermo Fisher Scientific) for 1 h at 37°C. Slides were washed three times for 5 min in PBS, adding 2 µg/mL DAPI (4,6-diamidino-2-phenylindole; Thermo Fischer Scientific) and 1 µM QUMA-1 (25) to the final wash, followed by three washes with DEPC treated water. Slides were mounted using ProLong diamond antifade (Thermo Fischer Scientific). Visualization was performed on a Nikon SA microphot microscope.

**Preparation of polyA RNA**

RNA was harvested from two independent parasite cultures using Trizol (Invitrogen), as previously described (26). RNA was treated with DNasel for 30 min and the absence of DNA was confirmed via PCR across an intronised gene, as previously described (27). RNA was then subjected to polyA purification via the NEBNext Poly(A) mRNA Magnetic Isolation Module (NEB), and quantified using a Nanospec 1000 (Thermoscientific, USA).

**rG4-seq library preparation**

The rG4-seq libraries were prepared as per our previous study, with minor modifications (18). Approximately 1 µg of mRNA was obtained after polyA RNA enrichment. Random RNA fragmentation was performed in buffer (final 1 x: 40 mM Tris–HCl pH 8.0, 100 mM LiCl, 30 mM MgCl₂) at 95°C for 45 s to result in RNA fragment size of ~250 nt, followed by RNA clean and concentrator-5 (Zymo research). Next, 3’ dephosphorylation was performed by using 8 µl RNA sample, 1 µl 10 x T4 PNK buffer and 1 µl T4 PNK enzyme (NEB) at 37°C for 30 min. Then, 3’ adapter ligation was conducted by adding 10 µl sample from above, 1 µl of 10 µM 3’ rApp adaptor (5’-/5’App/AGATCGGAAAGACGACAGTCTC-3’), 1 µl 10 x T4 RNA ligase buffer, 7 µl PEG8000 and 1 µl T4 RNA ligase 2 K227Q (NEB) at 25°C for 1 h, followed by RNA clean and concentrator and eluted in nuclease-free water. The eluted sample was then split into two parts for 150 mM Li⁺ and 150 mM K⁺ for reverse transcription (~12 µl each), with 1 µl of 5 µM reverse primer (5’-CAGACGTGTGGCTTTCCGATCT-3’) and 6 µl of 5 x reverse transcription buffer (final concentration 20 mM Tris, pH 7.5, 4 mM MgCl₂, 1 mM DTT, 0.5 mM dNTPs, 150 mM LiCl or 150 mM KCl). The mixture was heated at 95°C for 1.5 min and cooled at 4°C for 1.5 min, followed by 37°C for 15 min before 1 µl of Superscript III (200 U/µl) was added. The reverse transcription was carried out at 37°C for 40 min, followed by treatment of 1 µl of 2M NaOH at 95°C for 10 min. 5 µl of 1 M Tris–HCl (pH 7.5) was added to neutralize the solution, before the sample was cleaned up by RNA clean and concentrator and eluted in nuclease-free water. To the purified and eluted cDNA samples (8 µl), 1 µl of 40 µM 5’ adapter was added (5’/5’Phos/AGATCGGAAAGACGCGTCGTTAGCTTCTCGATCTN8/3’/3’). The sample was heated at 95°C for 3 min, cooled to room temperature, and 10 µl of 2 x Quick T4 ligase buffer

**MATERIALS AND METHODS**

**Parasite culture and drugs**

The 3D7 strain of \( P. falciparum \) was obtained from the Malaria Research and Reference Reagent XResource Center (MR4). Parasites were cultured as previously described (23), in gassed chambers at 1% O₂, 3% CO₂ and 96% N₂. Parasite growth and morphology was assessed on blood smears stained with Hemacolor (Merck). Synchronised parasite cultures were obtained by performing two treatments with 5% d-sorbitol (24) 42 h apart, to yield an approximately 4-h window of ring stage parasites.

**Visualisation of rG4s by fluorescent microscopy**

Air-dried slides of 3D7 parasites were made, after saponin-mediated release of the parasites from host erythrocytes. Cells were fixed with 8% formaldehyde/HEPES pH 7.4 for 10 min and then with 4% formaldehyde/HEPES pH 7.4 for 10 min at room temperature (RT). Permeabilisation was done in 0.05% TritonX for 10 min. Enzymatic treatments were performed as followed: 0.12 U µl⁻¹ Turbo DNase (Albion) or 5 U RNase A and 20 U RNase T1 (RNase Cocktail enzyme mix, Thermo Fisher Scientific) for 1 h at 37°C. Slides were washed three times for 5 min in PBS, adding 2 µg/mL DAPI (4,6-diamidino-2-phenylindole; Thermo Fischer Scientific) and 1 µM QUMA-1 (25) to the final wash, followed by three washes with DEPC treated water. Slides were mounted using ProLong diamond antifade (Thermo Fischer Scientific). Visualization was performed on a Nikon SA microphot microscope.
and 1 µl Quick T4 DNA ligase (NEB) were added and incubated at room temperature overnight. The ligated cDNAs were purified by pre-cast 10% urea denaturing TBE gel and the size 90-450 nt was cut, followed by the gel extraction step using crush and soak methods. Next, a PCR reaction (20 µl) was performed using 95°C: 3 min, 12 cycles of each temperature step (98°C: 20 s, 65°C: 15 s, 72°C: 40 s); 72°C: 1 min, 1 µl 10 µM forward primer (5′ AATGATACGGGACACGAGATCTACACTCTTTCCCTACACGACGCTCTTCCGATCT 3′) and 1 µl 10 µM reverse primer (e.g. index 2) (5′ CAAG CAGAAGACGGCATACGAGATACATCGGTGACTGGAGTTCAGACGTGTGCTCTTCCGATCT 3′) and 8 µl DNA template and 10 µl 2× KAPA HiFi readymix. The amplified libraries were purified with 1.8% agarose gel for 50 min at 120V, and the size 150-400 bp was sliced and extracted with Zymoclean Gel DNA Recovery Kit. The purified libraries underwent qPCR with KAPA Universal Quant Kit. A total of six sequencing libraries were generated with two biological replicates and three conditions (2 rG4-stabilizing conditions: 150 mM K+, and 150 mM K+ with 5 µM PDS; and 1 rG4-non-stabilizing condition: 150 mM Li+). These were subjected to next-generation sequencing on NEXTseq 500 (Illumina).

**rG4-seq data analysis**

Pre-processing and short read alignment of sequencing data were conducted as previously described (28). Reverse transcriptase stalling (RTS) site analysis and rG4 calling were conducted using the rG4-seeker pipeline (28). The definition of rG4 structural motifs has been previously described (18,28). In brief, sequencing reads from rG4-stabilizing conditions (K+ and K+ /PDS) were compared to those from non-rG4-stabilizing condition (Li+) to detect RTS sites specific to the rG4-stabilizing conditions, resulting in four sets of RTS sites detections (two replicates, two rG4-stabilizing conditions). Each set of detected RTS sites were then analysed independently to identify the rG4 motifs responsible for generating the RTS event. The intersection and union of identified rG4s across the two biological replicates and the two rG4-stabilizing conditions were computed based on the overlapping of genomic coordinates of the rG4 sequences.

**P. falciparum genome sequence and transcriptome annotation sources**

The reference genome and transcriptome annotation for *P. falciparum* (3D7) were downloaded from PlasmoDB (29). As the transcriptome annotation from PlasmoDB lacked UTR information, the 2000 nt upstream and downstream of each annotated protein coding gene were flagged as ‘predicted’ 5′ UTR/3′ UTR regions, as described in (4). The curated UTR annotations reported by Chappell et al. (30) were then appended to the annotation. UTR regions that were encompassed by both predicted and curated UTRs were considered as curated UTRs.

**Annotation of repeats in the *P. falciparum* genome**

DNA repetitive elements in the *P. falciparum* genome were annotated using RepeatModeler and RepeatMasker software at default settings (31). The overlap between rG4 sequences and repetitive elements was computed using bedtools (32).

**G/C content calculation**

G/C content of rG4 sequences and rG4 flanking sequences was calculated directly. The G/C content of transcripts was calculated in sliding windows of 50 nt and at increments of 10 nt. The statistical significance of differences in G/C content for various set of sequences was computed using Wilcoxon rank-sum test for two samples.

**Low-complexity peptide region (LCR) analysis**

The peptide sequence matching an rG4 and its ±50 nt flanking sequence was first extracted from the full protein sequence of the rG4-harbouring gene. Any peptide subsequence of at least 10 amino acids that matched the following composition bias or tandem-repeat definition was then exhaustively searched for:

- Composition bias—80% of the peptide sequence is composed of one kind of amino acid residue; or 100% of the peptide sequence is composed of two kinds of amino acid residue, where one kind takes <80% and the other kind takes >20%.

- Tandem repeats—the peptide sequence is composed of at least three repeat units of 3–10 amino acids. Imperfections in the repeats (substitution/insertion/deletion of 1 amino acid residue) were tolerated if the number of imperfections was ≤2 (for peptide sequences longer than 11 residues) or ≤1 (for other peptide sequence lengths).

If more than one sequence or type of LCR was identified, the longest LCR with least number of imperfections was chosen for reporting. If both composition bias and tandem repeats were present, the composition bias was chosen for reporting.

**Gene Ontology (GO) analysis**

GO term annotations for *P. falciparum* were downloaded from PlasmoDB (29). GO enrichment analysis were conducted on the PANTHER platform (33), using a deduplicated list of rG4-harbouring gene IDs as input.

**G4-seq data analysis**

Processed *P. falciparum* G4-seq peaks in BED format were downloaded from Gene Expression Omnibus (accession number GSE110582) (34).

**In vitro transcription and translation**

The genes ApiAP2 (PF3D7_0934400) and rifin (PF3D7_1254400) were PCR amplified using Q5 DNA polymerase (NEB) from *P. falciparum* cDNA with overhang primers to insert a 5′ MluI and a 3′ SmaI restriction site. After digestion of the PCR product using MluI and SmaI for 1 h at 37°C, the DNA fragments were cloned into a version of the pTnT vector (Promega) where the multiple cloning site had been replaced by a synthetic construct.
(Genewiz) composed of a 5′ HiBiT tag (Promega), a new multiple cloning site and 3′ 3xHA tag. Disruption of the G4 motif in both genes was performed by site-directed mutagenesis using Phu Turbo (Agilent) and DpnI (ThermoFisher). Prior to in vitro transcription, each construct was linearised using BamHI (ThermoFisher) and purified via phenol/chloroform and ethanol precipitation. 1 μg of linearised plasmid was incubated for 2 h at 37°C with 1 U T7 RNA polymerase (ThermoFisher), 5 mM DTT, 4 mM NTPs (ThermoFisher) and 50 U Superase (Invitrogen). Translation products were treated with 10 Kunitz units of RNase-free DNase (ThermoFisher) at 37°C for 45 min, then purified as above.

Translation was performed in Flexi® Rabbit Reticulocyte Lysate (Promega) supplemented with amino acid mixture minus methionine and leucine, 60 nM each, Complete Protease inhibitor (Roche) and 20 U Superase protease inhibitor (Invitrogen). Transcripts were first denatured and refolded by incubation at 95°C for 5 min followed by 15 min at RT with 150 mM KCl or LiCl. Translation was performed for 60 min at 30°C with 300 ng of transcript in three independent reactions. Each reaction was stopped by the addition of 4:1 (v:v) blocking solution (1 mg of cycloheximide, Complete protease inhibitor in PBS). Luciferase activity was measured via the HiBiT tag using Nano-Glo® HiBiT Extracellular Detection System (Promega) on a FLUOstar Omega (BMG Labtech). Data were analysed with Graphpad Prism using a two-way ANOVA and a Bonferroni correction for multiple testing.

Ligand-enhanced fluorescence assay

Enhanced fluorescence assays with all ligands—ThioflavinT (ThT), NMM, QUMA-1 and ISCH-oa1—were performed as previously reported (22). In summary, in a reaction volume of 100 μL, 1 μM RNA was mixed with 10 mM LiCac (pH 7.0) and 150 mM KCl or LiCl. Samples were annealed at 95°C for 5 min and cooled to RT for 15 min for renaturation to occur. Samples were then transferred into a 1 cm path-length quartz cuvette and 5 μL of 20 μM ligand, ThT, NMM, QUMA-1 or ISCH-oa1 (final concentration of 1 μM) was then added. Excitation was at 425, 394, 555 and 570 nm for ThT, NMM, QUMA-1 and ISCH-oa1, respectively, and the emission spectrum was collected from 440–770, 550–750, 575–800 and 590–750 nm, respectively. Measurements were performed using a HORIBA FluorMax-4 and spectra were acquired every 2 nm at 25°C for both WT and rG4mut RNA oligos. For full transcripts rather than RNA oligos, the same procedure was followed after in vitro transcription, with a few alterations: 200 nM transcript was used with 4 μM QUMA-1. Spectra were measured using a Cary Eclipse Fluorescence Spectrophotometer (Agilent).

Circular dichroism assay

As previously reported (35,36), reactions were set up in 2 ml samples of 5 μM RNA prepared in 10 mM LiCac (pH 7.0) and 150 mM KCl or LiCl. All RNAs were folded as described above and measurements were conducted using a Jasco CD J1500 spectropolarimeter and a 1 cm path-length quartz cuvette. Spectra were acquired every 1 nm from 220 to 310 nm at 25°C for WT and rG4mut RNA oligos. All spectra reported are the average of 2 scans with a response time of 2 s/nm, normalised to molar residue ellipticity and smoothed over 5 nm. All data were analysed with Spectra Manager™ suite (Jasco Software).

Thermal melting monitored by UV spectroscopy

Thermal melting monitored by UV spectroscopy was performed using a Cary 100 UV–Vis spectrophotometer and a 1 cm path-length quartz cuvette with a reaction volume of 2 ml (36). Samples were prepared and renatured as per the circular dichroism experiment above. Data were collected over 0.5°C increments while heating over the temperature range 5–95°C. The unfolding transitions were monitored at 295 nm for the WT and rG4mut RNA oligos to look for the inverse melting G4 signature. Data were smoothed over 5 nm.

Translation efficiency analysis

Translation efficiency was calculated as the ratio of ribosome-protected footprints (Ribo-Seq) to mRNA reads (RNA-Seq) across each mRNA, using published P. falciparum Ribo-Seq data (37). Significant differences between the TE distributions of genes harbouring or lacking rG4s were assessed by Student’s t-test. Coverage of Ribo-Seq and RNA-Seq for individual genes was visualized via GWIPS-viz Genome Browser (https://gwips.uec.ie, (38)) or the Mochiview browser (39).

Plasmid construction and parasite transfection

To generate the rG4 reporter parasite lines, three genes harbouring an rG4 on the positive strand were selected, rifin (PF3D7_0700200), RAD54 (PF3D7_0803400) and AP2 (PF3D7_0934400). The 3′ portion of each gene containing the rG4 was cloned in-frame with the 3xHA tag in a pSLI vector designed for selectable integration into the P. falciparum genome (40). Briefly, all PCR reactions were performed using Phusion (NEB) with primers to add a 5′ Eco52I restriction site and a 3′ KpnI restriction site (see Supplementary Table S3 for oligos). PCR products and plasmids were digested with Eco52I and KpnI (Thermo Fisher Scientific), purified using QIAquick PCR Purification Kit (Qiagen), then cloned using T4 DNA ligase (Thermo Fisher Scientific). The G4mut variants with point-mutations designed to disrupt the G4 motif were generated as previously described in the methods section on in vitro transcription. All plasmids were transformed into PMC103 electro-competent bacteria using a Gene Pulser Xcell Electroporation System (Bio Rad) and 0.1em cuvettes (Bio Rad). All constructs were checked by restriction digestion and sequencing.

Plasmids were transfected into the 3D7 strain of P. falciparum using standard procedures (41). Transfectants were selected with 4 nM WR99210 (Jacobus Pharmaceuticals), then selection for parasites with genomic integration of the pSLI plasmid was performed with 400 μg/ml of G418 (Sigma). Recombinant parasites were checked for correct rearrangement by PCR (Supplementary Table S3).
The Malaria SYBR Green I-based fluorescence (MSF) assay was used to measure parasite growth in the presence of DNA damaging agents, essentially as previously described (43). Trophozoite-stage cultures of each parasite line were seeded in triplicate into 96-well plates at 1% parasitaemia, 4% haematocrit, with serial dilutions of the drugs in line were seeded in triplicate into 96-well plates at 1% parasite growth was calculated as follows from the amount of DNA detected via SYBR Green I: 100 × \( \frac{\mu_{(i)-}}{\mu_{(i)+}} \) where \( \mu_{(i)-} \) and \( \mu_{(i)+} \) are the means of the fluorescent readouts from sample wells (\( \mu_{(i)} \)) control wells with 100 \( \mu \)M chloroquine (\( \mu_{(c)-} \), representing 0% growth), and control wells with non-drug-treated parasites (\( \mu_{(c)+} \), 100% growth). 50% inhibitory concentrations (IC50) for each drug on each parasite line were calculated using GraphPad Prism.

RESULTS

G-quadruplexes can be detected in P. falciparum RNA

The most direct route to demonstrate the presence of G-quadruplexes in cells is arguably to visualise them with microscopy. Cell-permeable G-quadruplex-specific fluorescent dyes have therefore been developed, some of which are specific for RNA rather than DNA (25). Structure-specific antibodies also exist (6) but do not distinguish RNA and DNA, although some antibodies can detect both structures (44).

We attempted to visualise rG4s specifically in cultured P. falciparum parasites using the rG4 dye QUMA-1 (25) (Supplementary Figure S1). A fluorescent signal was seen throughout the parasites and this appeared to be somewhat RNase-sensitive, but much of the signal was apparently nuclear and DNase-sensitive, suggesting that the QUMA-1 dye is not as RNA-specific in P. falciparum cells as it is in human cells. Similarly, we attempted to visualise rG4s with the antibody BG4, but although this does give a faint cytoplasmic signal indicating rG4s in human cells, it was not successful in very small Plasmodium cells. DNA G4s are likely to dominate in parasite nuclei, particularly in telomers, while rG4s, if present, are likely to be less abundant and more dispersed throughout the cytoplasm, so they may be difficult to detect via microscopy.

We proceeded to use rG4-seq (18) to detect rG4s and to obtain a comprehensive catalogue of these motifs in the P. falciparum transcriptome. We conducted rG4-seq using RNA extracts obtained from duplicate cultures of mixed-stage asexual parasites (3D7 strain), enriched for polyadenylated RNA. Under an in vitro rG4 stabilizing condition (buffer containing 150 mM K+), >300 reverse transcriptase stalling (RTS) events associated with PQSs were detected by rG4-seq (Figure 1A). The number of detections further increased to >2000 when the rG4 stabilizing ligand pyridostatin (PDS) was included in the buffer (Figure 1A). Across all rG4-seq experiments, >95% of the RTS events captured were associated with various categories of PQS (examples of each category are shown in Supplementary Figure S2), which confirmed that these events were highly specific to genuine rG4s and that the false discovery rate was low (Figure 1A). By comparing the detection results between biological replicates, we found that >70% of the RTS events were reproduced, coherent with the outcomes from an earlier rG4-seq experiment in human cells (18) (Figure 1B, C). Reproducibility was best amongst what might be considered the highest-confidence PQSs: both canonical and non-canonical rG4 motifs, with the non-canonical category including bulged and 2-quartet motifs (Figure 1B). Reproducibility was lower amongst the set of guanine-rich sequences that may have G4-forming potential, but with structural imperfections (Figure 1C). Overall, the experiments confirmed that rG4s can fold in P. falciparum mRNAs, with a unified set of 2569 rG4s detected (Supplementary Datasheet S1).
Figure 1. The landscape of rG4s in the *P. falciparum* transcriptome. (A) Distribution and reproducibility of RTS sites detected in rG4-seq experiments. RTS sites were assigned to rG4 structural classes according to their adjacent nucleotide sequences. RTS sites classified as ‘Others’ were considered false positive detections as their adjacent nucleotide sequences do not satisfy the minimum requirements for forming quadruplex or triplex structures. (B, C) Reproducibility of RTS sites detected by rG4-seq experiments for the rG4s in the four well-established structural classes (B) and in other classes (C). K+ refers to the rG4-seq experiments conducted in potassium ions alone; K+-PDS refers to RNA folding in potassium plus pyridostatin. (D) Distribution of detected rG4s of seven different classes within the coding regions and untranslated regions of *P. falciparum* protein coding genes. (E, F) Summary of the number of rG4s detected per *P. falciparum* gene, considering only canonical and non-canonical rG4 motifs (E) or all rG4 motifs (F).
Detected RNA G-quadruplexes in *P. falciparum* are mostly non-canonical

The detected rG4s in the *P. falciparum* transcriptome were mostly located in the CDS regions of protein coding genes, rather than in the UTRs (Figure 1D), as expected in a genome with G/C content of ∼20–30% in CDS, but only ∼12–15% in non-coding regions. Moreover, based on their nucleotide sequences, most of the rG4s were classified as non-canonical motifs (e.g. bulged or two-quartet) (Figure 1A, D), similar to the findings of rG4-seq in human cells (18). These imperfections do not necessarily compromise rG4 folding but they have been suggested to have a negative impact on the thermostability of the resultant rG4 structures (18,45). The *P. falciparum* transcriptome also harboured many guanine-rich potential rG4s and RNA sequences not matching the four better-established structural motifs (e.g. bulged or two-quartet) (Figure 1E) and this rose to 510 genes contained at least one rG4 from the four better-established structural motifs (Figure 1E, F). Given the low overall G/C content of the *P. falciparum* transcriptome, the prevalence of rG4s in these genes is striking.

The *P. falciparum* transcriptome does contain some canonical rG4s

To further explore any perceived discrepancies between rG4-seq results and prior *in silico* analyses of the *P. falciparum* genome for PQSs that might form in DNA (4,8); those analyses examined only sequences biophysically and confirmed their ability to form in silico quadruplex G-triplex (rG3) motifs that could potentially fold into G-triplex structures despite their nucleotide sequences not matching the four better-established structural motifs definitions (46). The *P. falciparum* transcriptome also harboured many guanine-rich potential rG4s and RNA sequences, we can still confirm that: a) outside of repetitive regions, canonical and long-loop rG4s are scarce in the *P. falciparum* transcriptome, and b) virulence genes including var and rifin (as well as a small number of other genes), do harbour a few non-repeat-associated canonical/long-loop rG4s in their CDS and/or UTRs.

Detected RNA G-quadruplexes are non-randomly distributed in the *P. falciparum* transcriptome

We next explored the distribution and sequence characteristics of non-canonical CDS rG4s in the bulged and two-quartet categories. These formed the bulk of the detected rG4s (and were not considered in previous analyses focussing on DNA PQSs because such motifs are not expected to be stable in DNA). We calculated the G/C content of each rG4 sequence and its 50nt 5′/3′ flanking sequences, then compared these with the G/C content of the CDS of the whole rG4-harbouring gene in 50nt sliding windows. As expected, the G/C content was highly elevated in the rG4 sequences themselves (Figure 2B). In addition, the flanking regions of bulged rG4 motifs had significantly higher G/C contents than the rest of the transcript, whereas this difference was much more subtle in the flanking regions of two-quartet rG4 motifs (Figure 2B).

To manually examining the nucleotide sequences of bulged rG4 motifs and their translated peptide sequences, we found that some of these rG4s overlapped with low-complexity peptide regions (LCRs) with a compositional bias of amino acid residues and/or tandem repeats of short peptides (Figure 2C). This observation motivated us to search *de novo* for LCRs in the codons that encoded detected rG4s, and then to annotate all non-canonical CDS rG4s based on their association with LCRs. Strikingly, we found that rG4s located in LCRs possessed distinct features. They were associated with a higher G/C content in the flanking regions (Figure 2D) and with multiple occurrences of rG4s within a single gene (Figure 2E).

We also examined the per-base G/C content of 5′ and 3′ flanking regions and observed a three-base periodicity in the average G/C content, reflecting the property of protein-coding sequences (Figure 2F). Furthermore, this revealed that the G/C difference between flanking regions of LCR and non-LCR rG4s was driven by the strength of the G/C spikes occurring once every three bases (Figure 2F). This important observation suggests that common repetitive elements in the *P. falciparum* genome, such as the GGGTGTA telomeric repeat and other repeats, are unlikely to be a direct cause of LCR CDS rG4s, since their repeat units are usually 7/8nts long and not a multiple of 3.

Overlap between RNA G-quadruplexes and experimentally determined DNA G-quadruplexes is limited

To explore any associations between RNA G4s and DNA G4s in *P. falciparum*, we compared the list of DNA G4s determined DNA G-quadruplexes is limited
Figure 2. Sequence features of *P. falciparum* RNA G-quadruplexes. (A) Summary of (G\(3N\)_x)\(4\) PQS prediction outcomes in protein-coding genes and their status of detection in rG4-seq. PQSs matching the canonical or long-loop motif definitions were considered as (G\(3N\)_x)\(4\) PQSs. Their location and...
An RNA G-quadruplex can affect in vitro translation of a *P. falciparum* gene

Having analysed the rG4-seq dataset *in silico*, we proceeded to investigate the biological effects of *Plasmodium* rG4s *via* *in vitro* and *in vivo* experiments. To assess the potential effect of rG4s on *P. falciparum* protein production we first conducted *in vitro* translation experiments. The gene PF3D7_0934400, encoding an ApiAP2 protein, was selected: it has a 2-quartet PQS on the coding strand which was found as an rG4 in our dataset. A second gene, PF3D7_1254400, was selected as a control: this encodes a rifin protein and has a PQS on the non-coding strand (4), so it was not found in our rG4 dataset. Both genes were cloned into an *in vitro* expression vector, pTnT-HiBiT, containing a T7 RNA polymerase promoter and a HiBiT bioluminescent tag. The original gene sequences were termed wild-type (WT) and site-directed mutagenesis was used to derive ‘G4mut’ constructs wherein the PQS was disrupted (Figure 3A).

The formation of the rG4 in the *ApiAP2* gene was confirmed using a range of different biophysical experiments (Supplementary Figure S5) conducted on WT and G4mut RNA oligos (Supplementary Table S3). We also assessed rG4 formation in full-length transcripts *after* *in vitro* translation—the first time, to our knowledge, that such an assessment has been made in full-length transcripts. For this, we used QUMA-1 as the rG4-specific binding agent (25). QUMA-1 fluorescence was much higher from the WT gene (both full-length and RNA oligo) than from the G4mut form (Figure 3B for full-length transcripts and Supplementary Figure S6 for oligos) and this required a G4-stabilising cation, i.e. K+ rather than Li+. The same experiment performed on the *rifin* gene (both full-length transcript and RNA oligos) gave no enhanced QUMA-1 fluorescence (Figure 3C and Supplementary Figure S6), consistent with the absence of rG4s. Collectively, the results indicate the formation of an rG4 in the *ApiAP2* WT transcript and not in the *ApiAP2* G4mut version, nor in the *rifin* transcripts.

Both versions of both transcripts were used to explore the potential effect of an rG4 on *in vitro* protein translation. Prior to translation, the transcripts were subjected to heat-denaturing and cation treatments, ensuring that rG4s would fold (when RNA was refolded in K+), or would not fold (when RNA was refolded in Li+ or without any cations: in these conditions other non-G4 secondary structures are likely to fold instead). All transcripts were then translated in rabbit reticulocyte lysate. The HiBiT nanoluciferase fused

termined experimentally using G4-seq (34) with our rG4-seq results. ∼40% of all DNA G4s fell on the sense strand of exonic regions (Supplementary Table S2A). Among these, only ∼20% of the DNA G4s overlapped with RNA G4s and all such RNA G4s originated from non-canonical sequences (Supplementary Table S2B). The lack of overlap between RNA G4s and DNA G4s is largely expected, owing to their different conditions for folding (47). Nevertheless, the small overlapping subset of RNA and DNA G4s does suggest that in *Plasmodium*, it is possible to fold both types of G4 from the same non-canonical quadruplex sequences with significant structural imperfections. Furthermore, among the exonic, sense-strand DNA G4s that reside within CDS regions, it was found that >50% coincide with LCRs (Supplementary Table S2C)—including 12 DNA G4s that also overlap with RNA G4s (Supplementary Data Sheet S3). The observation suggests mutual connections between LCRs and both DNA and RNA G4s in *P. falciparum*.

### RNA G-quadruplexes tend to occur in genes with specific GO terms

To evaluate the potential functional significance of *P. falciparum* rG4s, we explored the associations between rG4-harbouring genes and *Plasmodium* biology via a gene ontology (GO) term enrichment analysis conducted on the rG4-harbouring genes. Some enriched GO terms appeared, but they were very broad and covered too many genes to define a clear biological process (Supplementary Figure S4A). We therefore altered the analysis strategy to identify the most common GO terms supported by five or more rG4-harbouring genes (Supplementary Figure S4B). This revealed at least three categories of interest: firstly, there were multiple GO terms related to pathogenesis, including antigenic variation and cell-cell adhesion—terms that primarily apply to variantly-expressed virulence genes such as var genes, confirming the earlier finding that var and rifin genes can encode rG4s. Secondly, there were multiple terms relating to stress-responsiveness, including proteotoxic stress and oxidative stress, both of which can be induced by human immune responses to malaria and by antimalarial drugs—indeed, the term ‘response to drug’ appeared as well. Thirdly, genes involved in transcription and regulation of transcription such as ApiAP2 transcription factors and chromatin modifiers were enriched: this is consistent with the formation of an rG4 in the *ApiAP2* WT transcript and not in the *ApiAP2* G4mut version, nor in the *rifin* transcripts.

![Figure](https://example.com/fig1.png)

**Figure 1**. GO term enrichment analysis was performed on the rG4-harbouring genes. Bar graphs indicate the non-overlapping enrichment of terms related to stress-responsiveness, pathogenesis, and transcription and regulation of transcription. *(A)* Comparison of GO term enrichment between all rG4-harbouring genes and all genes in the *Plasmodium* genome. *(B)* Comparison of GO term enrichment between rG4-harbouring genes and non-rG4-harbouring genes. **(C)** Comparison of GO term enrichment between rG4-harbouring genes and low-complexity peptide region (LCR) genes. (E) Summary of the numbers and the degree of clustering of rG4-harbouring genes that are adjacent/not adjacent to LCRs. Dashed lines mark base positions that are multiples of 3. These indicate a three-base periodicity in the fluctuation of per-base G/C content. While both types of rG4 have similar patterns of fluctuation, the spikes are considerably higher for LCR CDS rG4s.

Overlapping status with repetitive elements are highlighted. *(B)* Comparative analysis of G/C content in CDS rG4s categorised as either bulged or two-quartet structural motifs. The G/C content of the rG4 motif, the rG4 flanking regions and the whole rG4-harbouring gene are plotted. P-values shown in each subplot indicates the outcome of a Kruskal–Wallis one-way ANOVA test comparing the three samples. *** indicates pairwise statistical significance in the difference between G/C contents (P < 0.005, Wilcoxon rank-sum test); ns indicates not significant. *(C)* Examples of CDS rG4s that overlap with gene sequences encoding low-complexity peptide regions. *(D)* Comparative analysis of G/C content in CDS rG4s that are adjacent/not-adjacent to low-complexity peptide regions (LCRs), regarding the G/C content of the rG4 motif, the rG4 flanking regions and the whole rG4-harbouring gene. P-values shown in each subplot indicates the outcome of a Kruskal–Wallis one-way ANOVA test comparing the three samples. *** indicates pairwise statistical significance in the difference between G/C contents (P < 0.005, Wilcoxon rank-sum test); ns indicates not significant. *(E)* Summary of the numbers and the degree of clustering of CDS rG4s that are adjacent/not-adjacent to LCRs. *(F)* Comparison of per-base average G/C content in the 50nt 5′ upstream and 3′ downstream flanking regions of LCR CDS rG4s and non-LCR CDS rG4s. Dashed lines mark base positions that are multiples of 3. These indicate a three-base periodicity in the fluctuation of per-base G/C content. While both types of rG4 have similar patterns of fluctuation, the spikes are considerably higher for LCR CDS rG4s.
Figure 3. In vitro folding of rG4 motifs in reporter genes and their impact on in vitro translation. (A) Schematic showing the WT and G4mut forms of the AP2 gene with its rG4-forming motif intact or mutated. (B, C) QUMA-1 fluorescence assay respectively on AP2 (B) and Rifin (C) full-length transcripts in the presence of LiCl or KCl. Two versions of each transcript were tested, the WT transcript and the rG4mut transcript where the sequence has been modified to prevent rG4 formation. (D, E) In vitro translation of AP2 and Rifin12 using the nano-luciferase HiBiT moiety as the detection method. The previously folded transcripts were used on rabbit reticulocyte lysate to produce the protein.

to each protein provided a quantitative readout of protein production. Luminescence levels obtained from the ApiAP2 genes showed that the absence of an rG4 could boost translation: protein production was two-fold higher from the G4mut transcript than the WT transcript, but only in rG4-forming conditions with K⁺ (Figure 3D, ANOVA, P-value = 0.0001). The same experiment performed on the rifin transcript, which evidently lacked an rG4, confirmed that subjecting these transcripts in G4-forming conditions had no impact on translation (Figure 3E; Supplementary Table S4).

Ribosome profiling suggests that RNA G-quadruplexes can affect gene translation in some P. falciparum genes

The effect of rG4s upon translation in P. falciparum was next investigated in the in vivo cellular context. Ribosome profiling and parallel RNA-Seq has been conducted in erythrocytic parasites at various stages (rings, trophozoites, schizonts and merozoites), enabling calculation of ribosome density per messenger RNA, or ‘translation efficiency’ (TE) (37,48). We calculated TE of all genes found to contain folded rG4s in our dataset (which covered transcripts from all erythrocytic stages) and compared this with the TE of all other genes in the transcriptome (Supplementary Figure S7A, B). In ring-stage-expressed genes, there was no significant difference; in trophozoites, TE was higher on average in rG4-containing genes, whereas in schizonts it was lower in rG4-containing genes. There was no clear relationship between TE and the number of rG4 motifs within a gene (data not shown).

This is a transcriptome-wide analysis: it shows the average translation efficiency across hundreds of genes with very different characteristics, and furthermore it assumes that an rG4 is equally likely to be folded at all erythrocytic stages. For more gene-specific resolution, we also investigated the individual profiles of a few genes encoding large clusters of overlapping rG4 motifs, to detect any relationship between the location of an rG4 cluster and the stalling or loss of elongating ribosomes. Five genes were selected that had the largest clusters of rG4s in which folding was detected, and four out of these five genes had convincing evidence of blood-stage expression in RNA-Seq. Figures 4A–D show the RNA-Seq and Ribo-Seq profiles for these four genes (data combined across all erythrocytic stages). Both types of coverage tended to drop in the region of the rG4 cluster, making it difficult to discern whether ribosomal occupancy dropped over and above the apparent drop in sequencing.
coverage (and furthermore, other RNA structures that impede ribosomes may, of course, also exist in these transcripts). However, in at least one instance (Figure 4D), the loss of Ribo-Seq coverage clearly exceeded the loss of RNA-Seq coverage, and in two cases (Figure 4A, C) the overall Ribo-Seq coverage downstream of the cluster dropped, suggesting a reduction in translating ribosomes. Importantly, the inability of Caro and co-workers (37) to sequence these regions efficiently in their RNA-Seq experiments does, in itself, suggest the presence of G-quadruplexes: either in the RNA, where they may cause fragmentation bias in poorly-denatured transcripts, or in the sequenced cDNA, where they may cause DNA polymerase stalling.

**Figure 4.** Translation efficiency of rG4-encoding genes. (A–D) Profiles of Ribo-Seq coverage and mRNA-Seq coverage for four genes containing large clusters of rG4s. Data obtained from (37), visualised via the GWIPS-Ribo-Seq coverage and mRNA-Seq coverage for four genes containing large rG4 clusters. Therefore, a controlled in vivo experiment was clearly required to discern the effects of these single rG4s on protein translation.

We modified each of the three reporter genes in the parasite genome to carry a 3′ 3xHA tag. The rG4 was either mutated or left intact, generating paired parasite lines with ‘WT’ or ‘G4mut’ tagged genes. Transcription of each reporter gene was measured by qRT-PCR at the erythrocytic stage of maximal transcription, controlled to the average transcriptional level of three housekeeping genes. Translation was simultaneously assessed by western blotting for the HA tag, using histone H4 as a loading control (Figure 5D). At the translational level, none of the reporter genes was strongly affected by the presence/absence of the rG4 (this was expected in the case of the 2-quartet G4s, which are likely to be stable only in RNA, not DNA). At the translational level, however, the AP2 and RAD54 genes were both clearly affected, with protein levels of Rad54 being as much as an order of magnitude higher when the rG4 was mutated (P = 0.027, n = 3). Translation of the G4mut rifin gene also trended upwards, but failed to reach statistical significance (P = 0.082, n = 3) (Figure 5E).

To examine whether levels of the most strongly affected protein, Rad54, could actually influence parasite biology, we tested the sensitivity of the WT and G4mut parasite lines to DNA damage, because Rad54 is expected to act in the repair of DNA double strand breaks (DSBs). We treated parasites with a DSB-inducing agent, etoposide, and also a DNA alkylating agent which is not a direct inducer of DSBs. The G4mut line, which expresses extra Rad54, was specifically less sensitive to etoposide when compared to the WT line (Figure 5F).

The strong biological effect of the presence/absence of an rG4 in the RAD54 gene led us to examine whether this variation could occur in wild strains of *P. falciparum*. Thousands of such strains have been sequenced from across the endemic world and indeed rG4-disrupting mutations do exist. A large proportion of the >13 000 strains in the current MalariaGEN database (49) were found to have short deletions encompassing some or all of the rG4-encoding sequence, while the commonest SNP (in ~2% of all strains) was a G-to-T mutation in the first guanine of the motif (TGAGGAGAGG). A variety of other rare SNPs and indels were also found (Supplementary Table S5). We tested the rG4-forming capacity of the motif when mutated with the commonest G-to-T SNP, as well as one other rare SNP found in PlasmoDB (29). Both strongly destabilised the rG4, such that it was unlikely to fold at physiological tem-
Figure 5. Translation of Rg4-encoding reporter genes in vivo. (A) Schematic showing the WT and G4mut forms of the Rad54 and rifin genes with the Rg4-forming motifs intact or mutated. (B, C) Profiles of Ribo-Seq coverage and mRNA-Seq for two of the selected Rg4 reporter genes, Rad54 and AP2. Data obtained from (37), visualized via the GWIPS-viz Genome Browser (38). The locations of the Rg4s are marked. The 5'-3' direction of the gene is indicated with a black arrow. (D) Western blots showing HA-tagged Rad54, Rifin and AP2 proteins in the WT and G4mut reporter lines. (AP2 transcription factors commonly dimerise and this AP2 protein, of predicted MW 24.6 kDa, appears to run primarily as a dimer at ~50kDa, plus higher-order multimer.) Control blots show histone H4 as a loading control. Images are representative of blots from three separate experiments. (E) Quantification by densitometry of the western blot data shown in (D) from three separate experiments, with the amount of HA-tagged protein controlled to histone H4. Quantification of the corresponding reporter-gene transcripts via qRT-PCR, controlled to the transcript levels of three housekeeping genes, is also shown. p-values are from two-tailed t-test: *P < 0.05, **P < 0.01, ns, not significant. (F) Comparison of DNA-damage sensitivity in the Rad54 WT and G4mut parasite lines, measured as 50% inhibitory concentrations of etoposide and MMS. Data are shown as mean and standard deviation of IC50 from four independent biological replicate experiments, each conducted in technical triplicate. p-values are from two-tailed t-test: ***P < 0.001, ns, not significant. (G) UV melting of the Rad54 Rg4 and related oligonucleotides, monitored at 295 nm. The melting temperature (Tm) is 72°C, 30.5°C and 18°C for Rg4 WT, G-to-T and G-to-A mutants respectively. The G4mut sequence did not form an Rg4 at all (no hypochromic shift observed), thus no Tm can be reported.
peratures (Figure 5G, Supplementary Figure S8). Therefore, rG4-based variation in the RAD54 gene can affect protein translation, and this could be a biologically relevant phenomenon in the field.

DISCUSSION

This study is the first experimental investigation of rG4s in the malaria parasite P. falciparum, an early-diverging eukaryote with a highly A/T-biased genome and many unusual features in its transcriptome (17,50). We present an initial overview of Plasmodium rG4s and anticipate that future work could usefully investigate these RNA structures in a stage-specific manner across the lifecycle. Nevertheless, we demonstrate here for the first time that rG4s can be found in this parasite and can affect gene translation.

Sequences with the potential to form G-quadruplexes are generally scarce in the P. falciparum genome and detection of rG4s using structure-specific antibodies or dyes is unlikely to give a full picture because such reagents probably do not detect rG4s at single-motif resolution (6). Furthermore, rG4s are likely to be dispersed throughout the cytoplasm, not arranged in arrays like telomeric DNA quadruplexes, so their visual detection is a particular challenge, even in large human cells (44). Accordingly, we found limited microscopic evidence for rG4s in P. falciparum.

By contrast, rG4-seq has very high resolution and it did reveal a surprisingly large number of rG4s in P. falciparum. This method also has limitations: the detection of low-abundance transcripts is inevitably limited by low sequencing coverage, and in P. falciparum the detection of rG4s in UTRs was particularly limited because these UTRs are extremely A/T-rich, repetitive and resistant to NGS sequencing and assembly. Hence, even accepting the very low guanine density of P. falciparum UTRs, these rG4s were almost certainly under-detected (just 149 of 2569 motifs were in UTRs, a stark contrast with the high rG4 density found in human and plant UTRs (18,19)). In fact, the detection of rG4s in all repetitive regions of the P. falciparum transcriptome proved to be limited by assembly issues. In future, long-read sequencing technology could be used to ameliorate this.

Our dataset contained a striking preponderance of non-canonical rG4 motifs, similar to the bias reported in the human rG4-ome (18), although P. falciparum showed an even higher proportion of 'degenerate' guanine-rich motifs. rG4 clustering was also a common feature in both human and Plasmodium genes: this may ensure that the biological effects of these motifs are robust to point mutations. It has also been proposed that biologically-important G4s may maintain 'spare tyres' of additional guanine tracts, making them more robust under oxidative stress which can oxidise guanine residues and thus disrupt G4s (51). Plasmodium parasites experience high levels of oxidative stress due to their endogenous metabolism and inflammatory responses in the host. Overall, it seems likely that both the existence and the clustering of rG4-forming motifs in some P. falciparum genes may be under positive evolutionary selection.

Another factor contributing to rG4 clustering is the interesting association that we observed between rG4s and sequences encoding low complexity peptide repeats, which are extremely common in P. falciparum (52). These LCRs can constitute broad regions that are relatively high in G/C due to the usage of G/C-rich codons, and they therefore frequently contained clusters of rG4 motifs, whereas non-LCR rG4s tended to be isolated and G/C-rich only within the motif itself. It remains unclear why LCRs are so heavily maintained in P. falciparum proteins but at least some of them are probably functional, for example in immune avoidance (52–54), and it is likely that a large subset of the rG4s in this transcriptome are a 'byproduct' of evolutionary selection for LCRs. Similar observations of substantial overlapping between DNA G4s and LCRs also supports this hypothesis. It would be particularly interesting if the converse was also true: that selection for clusters of rG4s in certain genes has led to the maintenance of LCRs.

In seeking biological functions for rG4s in P. falciparum genes, we found several classes of genes that were enriched for rG4s, including variantly-expressed virulence genes, stress-response genes and genes encoding chromatin or DNA-modifying proteins. The rG4s in var genes were probably actually under-detected, due to the repetitive nature of many of these motifs, and because the var gene family is mostly transcriptionally silenced. Reasons for DNA quadruplexes being associated with var genes have been proposed (4,14), but it remains unclear if rG4s have additional roles in post-transcriptional var gene regulation. Why genes for DNA-binding proteins should be enriched for rG4s is also unknown, but this feature appears in the human rG4-ome too (18). These essential genes may require particularly close control with layers of post-transcriptional regulation, since their transcripts are generally enriched in conserved RNA structures (55). Finally, for stress-responsive genes it would make sense to evolve several layers of regulation in a parasite that experiences regular stresses from host immune responses and from temperature and environmental changes accompanying transitions between hosts. In plants, the transcripts of stress-responsive genes have been reported to be particularly unstructured and prone to degradation after severe heatshock (56); perhaps in P. falciparum it could instead be beneficial to stabilise these transcripts via stable quadruplex structures.

Experimentally, we have reported here the first examples of rG4-dependent gene translation in P. falciparum. Our results conform to a common model in which sense-strand rG4s can inhibit ribosomal translation: this effect appeared in three different reporter genes in vivo, and was similar in the AP2 reporter gene under in vitro translation. Notably, the effects of rG4s can be modulated by binding proteins so they are not always the same in vitro and in vivo: it may be that different rG4-encoding genes behave differently within the parasite. Indeed, there are some examples of translational enhancement by rG4s in vivo (57), but inhibition is probably more common, as was reported recently in a transcriptome-wide study in plants (19). Our reporter genes all showed inhibition, but our transcriptome-wide analysis of translation efficiency in Plasmodium suggested stage-specific effects, with rG4s affecting translation differently in trophozoite-expressed versus schizont-expressed genes. To investigate this interesting possibility further, stage-specific and in vivo rG4 mapping experiments would be required, which are beyond the scope of this initial study.
We detected a particularly strong translation-inhibiting effect from the 2-quartet rG4s in the RAD54 and AP2 reporter genes, and a weaker effect in therifin gene. This may be partly because the rG4s were completely ablated in the G4mut versions of RAD54 and AP2, as shown by biophysical assays, whereas the G4mut rifin gene retained a potential 2-quartet rG4 instead of a 3-quartet motif. The effect in the RAD54 gene was particularly interesting because it had a phenotypic impact, affecting the DNA repair capacity of mutant parasites, and because this is likely to be replicated in wild strains of *P. falciparum*, in which the rG4-forming motif is commonly mutated or deleted. This could in turn influence important factors like genomic mutation rates and responses to DNA-damaging antimalarial drugs such as artemisinins. Higher and lower levels of Rad54 expression could be advantageous under different environmental conditions, explaining why only some parasite strains harbour G4-disrupting mutations.

In conclusion, the G-quadruplex biology of malaria parasites remains an exciting area for future study. It is possible that rG4s may form therapeutic targets, and the idea of repurposing G4-binding molecules as antimalarial agents has already been suggested (12). Such work might also include the development of peptides and aptamers besides traditional small-molecule drugs: this is a fast-developing area as highly-specific G4 binding agents are increasingly being sought. In the area of basic biology, life-cycle-stage-specific studies, and also in *vivo* rG4 mapping, are obvious avenues for discovering how these motifs could affect stage-specific parasite biology. The discovery of *Plasmodium* rG4-binding proteins is another clear avenue for investigation, particularly as the expression of such proteins probably varies with life-cycle stage. Finally, although this initial study focussed on mRNA, biologically-important non-coding RNAs might also contain rG4s. Since this is only the first report on the effects of rG4s in *P. falciparum*, much of the fundamental biology associated with these interesting motifs remains to be discovered.

**DATA AVAILABILITY**

Raw data from the rG4-seq experiment are available in SRA, accession number PRJNA706892. All other data are available within the manuscript and its supplementary figures.

**SUPPLEMENTARY DATA**

Supplementary Data are available at NAR Online.

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