Homology-Based Prediction of Potential Protein– Protein Interactions between Human Erythrocytes and *Plasmodium falciparum*



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ABSTRACT: *Plasmodium falciparum*, a causative agent of malaria, is a well-characterized obligate intracellular parasite known for its ability to remodel host cells, particularly erythrocytes, to successfully persist in the host environment. However, the current levels of understanding from the laboratory experiments on the host–parasite interactions and the strategies pursued by the parasite to remodel host erythrocytes are modest. Several computational means developed in the recent past to predict host–parasite/pathogen interactions have generated testable hypotheses on feasible protein–protein interactions. We demonstrate the utility of protein structure-based protocol in the recognition of potential interacting proteins across *P. falciparum* and host erythrocytes. In concert with the information on the expression and subcellular localization of host and parasite proteins, we have identified 208 biologically feasible interactions potentially brought about by 59 *P. falciparum* and 30 host erythrocyte proteins. For selected cases, we have evaluated the physicochemical viability of the predicted interactions in terms of surface complementarity, electrostatic complementarity, and interaction energies at protein interactions. The predicted host–parasite interactions generate many experimentally testable hypotheses that can contribute to the understanding of possible mechanisms undertaken by the parasite in host erythrocyte remodeling. Thus, the key protein players recognized in *P. falciparum* can be explored for their usefulness as targets for chemotherapeutic intervention.

KEYWORDS: homology-based approaches, host-parasite interactions, protein-protein interactions, Plasmodium falciparum

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Introduction

Malaria, a potentially lethal mosquito-borne disease, has existed as a public health burden for many decades, currently placing 1.2 billion of the world's population at high risk.¹ This disease is caused by parasites belonging to Plasmodium genus. Of the five species of parasites known to cause malaria, Plasmodium falciparum, Plasmodium vivax, Plasmodium malariae, and Plasmodium ovale are pathogenic to human, of which P. falciparum is the most prevalent. P. falciparum is essentially an obligate intracellular parasite with a complex life cycle, exhibiting varied morphological stages in different tissue types in two different hosts: humans and female mosquitoes of the genus Anopheles.² The remarkable ability of the parasite to adapt to varied challenges posed by the hosts, in terms of heterogeneous environmental conditions and immunological responses, has facilitated successful pathogenesis and persistence of the parasite over the course of coevolution with its hosts.

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In addition to the adaptive changes brought about by the vast reorganization of cellular processes, the parasite has also the capability to remodel host cells, particularly erythrocytes, to suit its niche during infection. During a blood meal of a mosquito vector, motile infective form of parasite known as sporozoites are injected into the blood stream, which then travel to liver where they undergo rapid multiplication and differentiation to generate large number of merozoites. The blood stages of infection begin once these merozoites released from liver cells invade the erythrocytes. Throughout the intraerythrocytic stages of the parasite's life cycle, including ring, trophozoite, and schizont, the parasite establishes intricate mechanisms to remodel erythrocytes for its growth and survival.³ Exploitative mechanisms achieved by the parasite include the acquisition of nutrients from the cytosol of red blood cells (RBCs) and from extracellular environ, mediation of cellular adhesion of infected RBCs to avoid splenic clearance, evading host immune response by associating antigenically variant proteins with erythrocyte surface, and the establishment of protein-trafficking machinery. Much of these mechanisms can be attributed to the parasite proteins targeted to RBC membrane.^{4,5} The intricateness in the massive remodeling of host RBCs induced by the parasite and the unusual plasticity of the parasite's metabolism through the various stages of its life cycle has been well studied.³⁻⁶ Moreover, the characterization of P. falciparum-infected and -uninfected RBCs with the help of optical tweezers, pursued previously by one of our groups, has provided a novel insight into the biomechanical properties of infected and uninfected cells.⁷ An interesting phenomenon observed is termed as *bystander effect*, which is the effect of infected RBCs on the physical properties of uninfected RBCs.7 This observation concurs with a similar established finding on exosome-like vesicles, proposed to participate in intercellular communication between infected RBCs.8 Despite the tremendous efforts in providing useful insights on RBC-parasite interactions, much of our understanding on molecular basis of host-parasite interactions is limited, essentially based on inferences obtained from experimental evidences.

Over the past several years, substantial efforts have been made toward the development of computational framework to predict protein-protein interactions with the help of evolutionary information^{9,10} that are primarily based on experimentally known interactions documented in various databases. However, interactions identified based on homology alone need rigorous evaluation in order to filter interactions in biological context. Functionally relevant interactions can be systematically identified by the use of molecular details of three-dimensional (3-D) structures of protein-protein complexes. By virtue of similarity to the structure of a protein complex, it is possible to determine and assess putative interacting residues in the homologous protein pair based on conservation. The credibility of the predicted interactions can then be enhanced by integrating additional information such as gene expression and subcellular localization in order to assess their ability to bind physically in the pathological context. The significance of such structure-influenced transfer of interactions between organisms has been realized and has formed the basis of several frameworks.^{11–13} On similar grounds, computational efforts to predict protein-protein interactions across human and pathogen(s) of interest have been successfully achieved by many groups^{14,15} as well as by one of our groups earlier.^{16–19}

The availability of completely sequenced genome of human and *P. falciparum*²⁰ and the rich catalog of experimentally determined interaction datasets has aided thorough computational investigations on probable protein–protein interactions within the parasite²¹ as well as across human and the parasite.²² Albeit elaborate, the proposed approach on predicting host–parasite interactions lacks stringent evaluation of the predicted protein partners in endogenous context. Integrating subcellular localization data of both host and parasite proteins



forms a critical filtering step as a pair of proteins predicted to interact may not be biologically feasible if they are localized in different compartments of the cell. In our previous study,¹⁶ we presented a data integration approach in order to detect protein-protein interactions across human host and P. falciparum, where information from experimentally identified protein-protein interaction datasets coupled with expression and subcellular localization data aided the identification of feasible host-parasite interactions. Much recently, a data intensive machine-learning approach was also employed²³ to predict protein interactions across human and P. falciparum. However, the inaccuracies in genome-scale high-throughput proteinprotein interaction datasets that are used by these approaches raise concern on false positives in the predictions. In a recently published study by one of our groups,¹⁹ an attempt was made to circumvent the dependence on high-throughput interaction data by considering an initial refined dataset of 3-D structures of protein complexes alone, to predict potential interactions across human host and Mycobacterium tuberculosis H37Rv. We demonstrate the utility of such a structural similarity-based protocol to predict biologically feasible protein-protein interactions across P. falciparum and host erythrocytes. The likelihood of these interactions is suggested by the information on expression profiles and subcellular localization of proteins involved and, most importantly, the 3-D structural compatibility to interact. For specific cases, we have pursued rigorous evaluation in terms of surface complementarity, electrostatic complementarity, and interaction energy at the interface regions to support the credibility of the predictions made.

Methodology

Datasets considered. Protein sequences of 5542 gene products of *P. falciparum* 3D7 were obtained from PlasmoDB (Version 12),²⁴ while for human red blood cell proteins, a recently updated and improved dataset of RBC proteome²⁵ was consulted, which reports a nonredundant list of 1989 gene products. We mapped this list to UniProt database²⁶ to obtain sequence information and annotations for RBC proteins, followed by the use of filters to exclude incomplete protein sequence entries (fragments), thus obtaining a final set of 1672 RBC proteins.

To pursue structure-influenced recognition of protein interactions, two datasets were used: (i) a cumulative dataset of structures of transient protein–protein complexes published earlier^{27–29} and (ii) a dataset of domain-centric protein–protein interactions from Protein Family Interactions (iPfam) database.³⁰ iPfam database provides a comprehensive resource of domain–domain interactions that are formulated using combined information from the structures of protein complexes in Protein Data Bank³¹ and their constituent sequence domains acquired from Protein Family (Pfam) database.³² Since the current definitions are primarily based on the calculations performed on asymmetric unit of protein complexes, we have restricted our dataset specifically to those interaction



definitions where the crystal asymmetric unit of a protein complex corresponds to a whole biological assembly. For the current analysis, we have considered heterodomain interactions from iPfam, ie, interactions between different protein domain families.

Generation of initial host–parasite interaction dataset. The identification of host and parasite proteins homologous to a known pair of interacting proteins forms the primary step in the recognition of host–parasite protein–protein interactions.

In order to determine homologs of structures of transient protein-protein complexes, we used family specific structural identifiers catalogued in the database of Structural Classification of Proteins (extended version SCOPe 2.04).³³ SCOP, an extensive database of manually curated protein structural relationships, hierarchically classifies protein domains into class-fold-superfamily-family based on structural and evolutionary relationships. A family specific identifier or SCOP code for a structural domain holds the information pertaining to its corresponding classification. Since evolutionarily related proteins tend to exhibit interactions in a similar manner, the family specific SCOP identifiers retrieved for transient protein-protein complexes were mapped to those identified in RBC and parasite proteins. The identification of SCOP domains in RBC and parasite proteins involved a search against a database of profile hidden Markov models³⁴ (HMMs) representing domains in proteins of known structure, at an *E*-value threshold of 0.0001. The profile HMMs of protein domains were retrieved from SUPERFAMILY database.³⁵ Similarly, protein sequence searches were also pursued against a database of HMMs representing Pfam domain families. The reliability of the Pfam domain assignments made was assessed using domain family specific gathering thresholds assigned by curators,36 which roughly correspond to an E-value cutoff of 0.01. The interactions between a pair of Pfam domain families suggested in iPfam database and the interactions between a pair of family specific SCOP identifiers obtained from the dataset of transient protein-protein complexes were thus used to predict putative interactions across domain families of RBC and parasite proteins. Appropriate filters were used to achieve biologically relevant protein-protein interactions across host RBC and the parasite, as discussed further.

Filter 1: Refining the template dataset. iPfam attributes the terms intrachain and/or interchain interactions to domains in a protein complex on the basis of the nature of polypeptide(s) and their proximity in the 3-D structures. We excluded the intrachain heterodomain interactions retrieved from iPfam, which were mapped to a single host RBC or a single parasite protein, as such interactions are less likely to occur across species. We had observed that homologs of co-occurring heterodomains in a multidomain protein rarely correspond to two different interacting proteins.³⁷ Considering this established observation, the exclusion of intrachain heterodomain interactions from the template dataset minimized the occurrence of false-positive predictions. Protein–protein complexes

that constituted synthetic constructs were also eliminated. All the protein complexes and the putative RBC-parasite protein-protein interactions deduced were manually curated to ensure their biological relevance.

Filter 2: Pruning intrahost interactions. Similar to the pruning steps in our previously published study,¹⁹ we did not consider intrahost and intrapathogen interactions in our subsequent analyses. These interactions usually correspond to ubiquitous interactions that are conserved within most organisms. We also eliminated those RBC-parasite interactions where the RBC proteins are also capable of exhibiting intrahost interactions. In other words, when the interfacial region of an intrahost protein-protein interaction is comparable to that of a host-parasite interaction, by virtue of similarity of host and parasite proteins to a single template protein complex, the predicted RBC-parasite interactions are not considered. This step ensured the recognition of targetable host-parasite protein-protein complexes. iPfam attributes the terms intrachain and/or interchain interactions to domains in a protein complex on the basis of the nature of polypeptide(s) and their proximity in the 3-D structures. We excluded intrachain heterodomain interactions retrieved from iPfam, which were mapped to a single host RBC protein.

Filter 3: Integrating additional information to extract biologically feasible interactions. Expression profile of parasite proteins for merozoite, ring, trophozoite, and schizont stages was extracted from PlasmoDB and mainly from three studies published earlier.³⁸⁻⁴⁰ Information on subcellular localization of parasite proteins was obtained from diverse sources. The parasite proteins that have been reported to constitute a host-targeting signal, ie, HT motif or PEXEL motif,^{41,42} and the exported proteins reportedly lacking PEXEL/HT motif (PNEPs)⁴³ were picked up. This criterion is of primary importance in recognizing feasible protein-protein interactions across P. falciparum and erythrocyte as the parasite resides within a protective encasing termed as parasitophorous vacuole during its intraerythrocytic development. Furthermore, to recognize putative interactions brought about by membrane proteins of the vacuole, we included parasite proteins that are established as parasitophorous vacuole membrane proteins.44 We also included parasite proteins associated with a specialized secretory compartment, Maurer's cleft.⁴⁵ Only those proteins of Maurer's cleft were considered that are either membranous or comprise an export signal. Merozoite surface proteins involved in host RBC invasion were also included.⁴⁶ The parasite proteins localized to the apicoplast and other cellular organelles were excluded since the associated proteins may not participate in a physical interaction with RBC proteins.

The subcellular localization data for RBC proteins (membrane, cytoskeleton, or cytosolic) were obtained from UniProt. This information becomes notably crucial in the RBC-*P. falciparum* system, where the parasite proteins specifically target enucleated or mature RBCs that lack nucleus and most of the cellular organelles. The RBC proteins localized to nuclear fractions and other cellular organelles were excluded



as such proteins could be remnants of degraded proteins of ancestral reticulocytes.²⁵

Given the set of 5542 parasite proteins and 1672 erythrocyte proteins, the number of possible interactions across the host erythrocyte and the parasite proteins is tremendously large. The use of appropriate filters at various levels, as discussed above, reduces false-positive predictions, thereby resulting in the recognition of probable host-parasite interactions in the endogenous context. Table 1 outlines the number of protein-protein interactions in the initial stages and the reduction in the number of false positives upon the inclusion of filters.

A schematic representation of the protocol followed is shown in Figure 1.

Results and Discussion

Probable host-parasite interactions and their influence on biological processes. The structure-influenced predictions in concert with a series of filters facilitated recognition of 208 physicochemically viable interactions accomplished by 59 *P. falciparum* and 30 host erythrocyte proteins. The distribution of 59 *P. falciparum* proteins across the intraerythrocytic stages is illustrated with the help of a Venn diagram in Figure 2. As depicted in the Venn diagram, the parasite proteins potentially involved in RBC-parasite interaction are distributed throughout the four stages, with highest (13) specific to the ring stage.

The potential influence on pathways and processes in RBC and the parasite were investigated based on the biologically feasible protein-protein interactions predicted across RBC and parasite proteomes. Functional annotations of the parasite proteins were obtained from PlasmoDB and the Malaria Metabolic Pathways database⁴⁷ and those of RBC proteins were retrieved from UniProt database. The putatively interacting protein pairs across the parasite proteins and the host RBC could be segregated into 11 and 10 functional categories, respectively, on the basis of the nature of their biological processes. Figure 2 illustrates the intraerythrocytic stage-specific distribution of 59 *P. falciparum* proteins across

Table 1. Recognition of functionally relevant interactions upon inclusion of appropriate filters, as discussed in the Methodology section.

EXPRESSED PROTEIN DURING INTRA- INTERACTION ERYTHROCYTIC STAGES	NS
Filter 1 1567 1296 14,965	
Filter 2 770 646 6775	
Filter 3 59 30 208	

its 11 functional categories (including conserved protein and cysteine repeat). Each bar represents the number of parasite proteins associated with a functional category, color coded based on stage-specific expression of its constituent proteins. The total number of host RBC proteins predicted to interact with the parasite proteins under each category is denoted by numbers in brackets. Also indicated in Figure 2 is the information on subcellular localization of parasite proteins pertaining to a functional category represented in the form of single letter tags. Evidently, a significant proportion of hostparasite interactions are potentially mediated by exported proteins followed by merozoite surface proteins of the parasite, as illustrated in the figure. This is in corroboration with well-studied observations on parasite proteins that induce host erythrocyte remodelling.⁴

In addition to the host-parasite interactions potentially brought about by parasitic proteins belonging to nine functional categories (rosette formation, kinase, RBC invasion, protease, protein traffic, immune evasion, adhesion, chaperone, and merozoite egress), we could identify two parasite conserved proteins of unknown function (PF3D7 0911300 and PF3D7_1463900), one of which is a cysteine repeat modular protein capable of influencing varied processes in host RBC. This finding is schematically detailed in Figure 3, which exemplifies the participation and the influence of the parasitic processes and pathways on the host cellular roles. The central sliced doughnut in the figure enumerates the parasite proteins under each functional category, and the number of host-parasite interactions influencing host cellular processes is represented as bars corresponding to each slice of the doughnut. Majority of the host-parasite interactions, as depicted in the figure, are mediated by parasite proteins participating in erythrocyte rosetting. Indeed, these proteins belong to the hypervariable P. falciparum erythrocyte membrane protein 1 family, encoded by var genes, which are known to mediate cytoadhesion of infected erythrocytes.48 The predominant influence on RBC proteins involved in cell adhesion and immune response, as shown in Figure 3, is in support of the established observation. Notably, RBC proteins involved in signal transduction (27 interactions), followed by RBC chaperones (17 interactions), are also potentially acted upon by the parasites. This observation is in conjunction with the exploitative mechanisms acquired by the parasite to maximally benefit from the host, which include the activation of various cellular signaling pathways and recruitment of host chaperones in order to mediate cytoadherence and establish protein-trafficking machinery for successful persistence in the host.49,50

Thus, our structure-based approach has the potential to complement established experimental findings and could provide suitable grounds to warrant an experimental follow-up. Table 2 summarizes the selected examples of interest. The complete list of putative RBC–parasite interactions is provided in Supplementary Table 1. Comparison with previously published



Figure 1. Workflow. A schematic diagram of the steps taken to generate host–parasite protein–protein interaction dataset is shown. The steps start with the consideration of two datasets of transient protein–protein complexes, followed by the identification of their homologs in host and the parasite proteome. The encircled numbers correspond to equivalent subsections on filters in the Methodology section, which facilitated the recognition of biologically relevant host–parasite protein–protein interactions.

computational studies on the identification of host–parasite protein–protein interactions^{16,23} yielded a set of five interactions mediated by three parasite proteins and four host proteins, which concurred with our predictions made. Interestingly, we also recognized three host–parasite interactions that concurred with experimental observations. These include interactions mediated by three erythrocyte-binding antigen proteins of the parasite, which bind to erythrocytes in a sialic acid-dependent manner.⁵¹ The host–parasite interactions in concordance with earlier studies are highlighted in Supplementary Table 1. Investigations on selected cases at the molecular level are discussed further.

Case study 1: Establishment of host-parasite protein-trafficking machinery. The parasite protein, SAR1 (PF3D7_0416800), is a small GTP-binding protein of 192 amino acid residues, which is involved in the crucial step of budding reaction in vesicle-mediated secretory pathway. Based on our protocol, we recognized one protein from host RBC as plausible interacting partner of SAR1. The predicted interaction between SAR1 and the host ADP-ribosylation





Figure 2. A schematic summary of RBC-parasite interactions. The stage-specific protein expression profiles of the parasite proteins are illustrated in the Venn diagram, while the bar graph depicts the number of parasite proteins under each functional category predicted to interact with host RBC proteins (denoted in brackets). The color codes in each bar are in correspondence with the color of stage-specific expression subsets shown in the Venn diagram. The single letter tags for all the functional categories of the parasite provide information on subcellular localization. The Venn diagram was created using an online tool (http://bioinformatics.psb.ugent.be/webtools/Venn/).



Figure 3. Influence of host–parasite interactions on biological processes and pathways. The central sliced doughnut represents 59 *P. falciparum* proteins, which are classified into 11 categories (slices) on the basis of biological pathways and processes. The bars environing the central doughnut correspond to the number of host–parasite interactions, associated with parasite proteins (each slice), that influence each of the host cellular processes. For textual clarity, the length of the bars has been scaled with respect to each slice.

P. FALCIPARUM GENE ID	BIOLOGICAL PROCESS/PROTEIN	EVIDEN	ICE OF STAGE-SPE	CIFIC EXPRES	SION OF THE	SUBCELLULAR LOCALIZATION	INTERACTING PARTNER IN HOST	SUBCELLULAR LOCALIZATION	BIOLOGICAL
	PRODUCT	RING	TROPHOZOITE	SCHIZONT	MEROZOITE		RBC (UniProt ID)		
PF3D7_0100100	Rosette formation	≻	z	z	z	Exported	P10747	Cell membrane	Immune response
PF3D7_0502400	Putative adhesin	≻	z	z	~	Parasitophorous vacuole membrane, Merozoite surface	P07996	Cell surface	Cell adhesion
PF3D7_0416800	Protein traffic	≻	×	≻	~	Exported (vesicles)	Q9NZ52	Cell membrane	Transport
PF3D7_1408100	Protease	≻	~	7	~	Parasitophorous vacuole membrane	P02549	Cytoskeleton	Cell shape
PF3D7_1463900	Conserved protein	z	Z	×	7	Exported (HTmotif)	015554	Cell membrane	lon channel

factor-binding protein GGA3 (Q9NZ52) is further investigated. The proteins SAR1 and GGA3 were recognized to be evolutionarily related to a protein complex (GTP-bound ADP-ribosylation factor, ARF-GTP, and GAT domain of ADP-ribosylation factor-binding protein GGA1) that demonstrates molecular basis of membrane recruitment of adaptor proteins such as GGA by ARF-GTP. This protein complex elucidated for a mammalian system plays a key role in vesicular transport by docking the adaptor protein GGA1 to membrane for increased efficiency in recognition of cargo receptors.⁵² The GAT domain of GGA1 reportedly undergoes conformational change to interact with ARF-GTP. The helix-loop-helix structure, acquired by the disordered N-terminal region of GAT domain, interacts with an interswitch region formed by two antiparallel β strands of ARF-GTP. This ARF-binding disordered region is conserved across the GAT domains of human GGAs, as demonstrated earlier.⁵² To assess the molecular and mechanistic details of the

host-parasite interaction mediated by the protein pair GGA3-SAR1, the disordered region (166-210) of the 723 residue protein GGA3 was modeled using MODELLER v.9.1453 with the help of template helix-loop-helix structure of GAT domain of GGA1, while reliable structural model for SAR1 (region: 22-191, model coverage: 89%) was obtained from ModBase, which is a large-scale comprehensive database of comparative protein structure models.⁵⁴ The models built were assessed for local structural matches with respect to the template protein complex using TM-align.55 The program assigns TM-score for a structurally aligned protein pair, which typically acquires a value in (0, 1]. A TM-score of ≥ 0.50 corresponds to convincing structural similarity, and a TM-score of <0.30 depicts random structural matches.⁵⁶ Table 3 provides an account of sequence and structural assessment of the hostparasite protein pair under investigation. As depicted in Table 3, a TM-score >0.9 could be achieved for both host and parasite protein structural models. Thus, GGA3-SAR1 protein-protein interaction was modeled using the template protein complex and a subsequent energy-minimization step was pursued using GROMACS (Version 4.5.5)⁵⁷ to achieve a stable form of the modeled complex. The putative host-parasite protein complex was then assessed for the conservation of interfacial residues. Figure 4 highlights the key conserved residues in the predicted GGA3-SAR1 complex. The predominant participation of hydrophobic residues at the interface, as shown in Figure 4, is similar to the hydrophobic interactions observed at the interface of the template protein complex,⁵² thus, suggesting usefulness of the predictions made. Additional comparative assessments in terms of shape complementarity and interaction energies at the interfacial region of GGA3-SAR1 protein complex were also pursued to evaluate our predictions further. We employed a shape correlation statistic $S_{,}$ availed through CCP4 suite of programs,⁵⁸ to quantify geometrical packing of the interface of the predicted protein complex. S. acquires a value from 0 to 1, where an S measure of 1 suggests



Table 2. Details of few examples of proteins in *P. falciparum* predicted to interact with host RBC proteins.



PROTEINS IN TEMPLATE COMPLEX (PDB CODE: CHAIN ID)	LENGTH OF THE PROTEIN/ DOMAIN	HOMOLOGOU PROTEIN	S	LENGTH OF THE PROTEIN/ DOMAIN	SEQUENCE IDENTITY BETWEEN TEMPLATE AND THE PROTEIN OF INTEREST	TM-SCORE BASED ON STRUCTURAL ALIGNMENT TOOL TM-ALIGN	NUMBER OF TOPOLOGICALLY EQUIVALENT RESIDUES
ARF-GTP 1J2J:A	166	P. falciparum	SAR1	192	35%	0.91	159
GAT domain of GGA1 1J2J:B	45	Human RBC	GGA3	45 (GAT domain: 166–210)	64.4%	0.99	41

Table 3. Details on sequence and structural assessment of the predicted host-parasite protein pair GGA3-SAR1.



Figure 4. Assessment of putative host–parasite protein pair GGA3–SAR1. (**A**) Sequence alignment of GAT domains of GGA3 and GGA1 (1J2J:B) and of SAR1 and ARF-GTP (1J2J:A) is described. The conserved interfacial residues are indicated with black arrows. (**B**) Probable binding pose of the predicted host–parasite interaction is shown in the illustration on the left panel, while the figure in the right panel delineates the residues participating in the GGA3–SAR1 interaction. The structures in Figure 4, 5, and 7 are generated using PyMOL (http://www.pymol.org/).⁷¹

perfectly complementing interacting surfaces, while an S_c value approximating to zero implies an interacting surface of uncorrelated topology. The shape correlation statistic for the template protein complex was determined to be 0.7, while the S_c measure recognized for the GGA3–SAR1 protein complex was 0.57, indicating comparable geometrical packing at the interfacial regions of the template and the modeled complex. Assessment of interaction energy for the host–parasite protein pair using FoldX,⁵⁹ an empirical effective energy function, yielded a comparable binding energy value of –12.14 kcal/mol against an interaction energy value of –16.86 kcal/mol obtained for the template complex crystal structure.

The significance of SAR1 in establishing proteintrafficking machinery in infected erythrocytes has been well demonstrated earlier. It has been postulated that SAR1 gets translocated to erythrocyte cytosol through a specialized secretory organelle, where it participates in trafficking proteins to erythrocyte membrane.^{60,61} These established observations are in successful accordance with the proposed GGA3–SAR1 protein–protein interaction, thus, implying functional relevance of probable host RBC-assisted protein-trafficking machinery brought about by the parasite.

Case study 2: Strategies acquired by the parasite to proliferate in the host environment. Calcium, a well-studied intracellular messenger in eukaryotes, is known to play a significant role in the regulation of diverse cellular processes and interactions. Several calcium ion-mediated processes are facilitated by the calcium-binding protein calmodulin. One such process is the regulation of cell membrane potential by calcium-activated potassium channels. The proper functioning of potassium channels aids in the regulation of intracellular osmolarity, membrane potential, and electrochemical



gradient, thus, forming an integral part of cellular viability.⁶² The chemomechanical gating mechanism for such potassium channels has been elucidated at the molecular level, earlier,63 where calcium-bound calmodulin reportedly binds to the channel and triggers its opening. The crystal structure of calmodulin-potassium ion channel complex elucidates the heterotetrameric association of calmodulin and calmodulinbinding domain of ion channel, that is, dimer of heterodimer. The oligomeric state of calmodulin and calmodulin-binding domain is a dimer in the absence of calcium ions, while the binding of calcium ions to calmodulin triggers the formation of an elongated heterotetrameric complex (Fig. 5), resulting in a rotary movement of the two calmodulin-binding domains, thus, serving as gates to drive open the channel.⁶³ Based on the structure-influenced approach, we identified probable interaction between host calcium-activated potassium channel protein 4, KCNN4 (UniProt ID: O15554), and conserved parasitic protein of unknown function, PF3D7_1463900.

PF3D7_1463900, a conserved parasitic protein of unknown function of 1071 amino acid residues, was identified to constitute an EF-hand domain region (calcium-binding protein) at its C-terminal end (896–1054). A reliable structural model, using MODELLER, could only be obtained for this region; however, the secondary structural content of the protein was determined to be 76% helical.⁶⁴ Likewise, a reliable structural model for calmodulin-binding domain of the 427 amino acid residue protein channel KCNN4 was retrieved from ModBase (region: 304–377). Since, the template protein–protein complex represents the interaction between calcium-binding domain and calmodulin-binding domain, we pursued the analysis on calcium-binding domain or EF-hand domain of the parasite protein and calmodulinbinding domain of host RBC protein channel KCNN4. The binding pose as observed in the template complex could not be directly extrapolated onto the host-parasite protein pairs, owing to the absence of conservation of interface residues. Thus, we probed the probable binding pose of the host-parasite complex with the help of protein-protein docking program ClusPro2.0.65 ClusPro2.0 identifies a large number of docked conformations, rigorously evaluates energies of each of the docked protein pairs, and recognizes modeled complexes with near-native conformations, which are usually present in the top-ranking clusters.⁶⁶ The putative low-energy docked conformation of the host-parasite protein pair, thus obtained, was probed in terms of surface complementarity and interaction energy of the complex. The calculations on geometrical packing at the interface of the predicted RBC-parasite complex yielded an S_c measure of 0.63, which is highly similar to the S_c score of the template complex of 0.68. The calculations on free energy of binding, pursued using FoldX, yielded an interaction energy value of -18.7 kcal/mol for the template complex, and a relatively better interaction energy value of -30.1 kcal/mol for the modeled complex. In order to support this finding, we investigated further in terms of electrostatic complementarity and interfacial residues stabilizing the modeled complex. The template complex exhibits the predominance of hydrophobic interactions at the interface apart from the long-range electrostatic contacts between positive surface of calmodulin-binding domain and acidic surface of calmodulin, which anchors calmodulin onto calmodulin-binding domain.63 A similar



Figure 5. Crystal structures of calmodulin and calmodulin-binding domain are shown in ribbon representation (PDB code: 1G4Y). The blue ribbon represents calmodulin-binding domain, and the red ribbon represents calmodulin with calcium ions depicted as green spheres.



overall electrostatic complementarity could be recognized in the predicted host–parasite complex, demonstrated by positive surface of calmodulin-binding domain of KCNN4 and acidic surface of calcium-binding region of PF3D7_1463900. This observed feature is illustrated in Figure 6, where the interacting host and parasite proteins are rendered as molecular surfaces colored on the basis of their electrostatic potential. The electrostatic properties for the predicted interacting proteins were calculated using Adaptive Poisson-Boltzmann Solver⁶⁷ tool availed through Chimera,⁶⁸ an extensive resource for molecular visualization and analysis. Figure 7 exemplifies the low-energy binding pose achieved and the probable hydrophobic interactions and electrostatic contacts brought about by residues at the interface contributing to the stabilization of the host-parasite modeled complex. As illustrated in the figure, the hydrophobic interactions are brought about by the residues Leu980 and Ile999 of the parasite protein and Leu319, Val365, and Val369 of the host protein, while the salt bridge forming residues correspond to Asp985, Glu995, and Glu1018 of the parasite protein and Lys312 and Arg362 of the host protein. These details show that similar pattern of interactions is brought about by residues, which are distinct from those



Figure 6. Perspective view of electrostatic complementarity of the modeled host–parasite complex. The host RBC and parasite proteins are rendered as molecular surfaces and are colored based on electrostatic potential (blue: positive, white/gray: neutral, and red: negative). The binding pose of the predicted interaction is illustrated, where the host calmodulin-binding domain in blue is anchored to the C-terminal lobe of EF-hand domain of parasite protein. The two panels show 180° perspective view of the electrostatic contacts between positive and acidic surfaces of host and parasite domains, respectively. This figure is generated using UCSF Chimera⁶⁵ (http://www.cgl.ucsf.edu/chimera).



Figure 7. Assessing host–parasite interacting surfaces. The binding pose of host calmodulin-binding domain and parasite EF-hand domain is delineated, where the domains are rendered as transparent ribbons and the putative interacting residues as sticks. Each of the salt bridge forming residues and the residues mediating hydrophobic interactions are highlighted separately. The side chains of the residues highlight hydrogen-bond interactions and hydrophobic interactions.



observed in the template complex.⁶³ The proposed binding pose for the modeled complex, where the calmodulin-binding domain of KCNN4 interacts predominantly with C-terminal lobe of the EF-hand domain of the parasite, is thus distinct from the pose observed in heterotetrameric template complex (Fig. 5). Such a binding mode could be suggestive of modulation or inhibition of channel activity of host RBCs. The inactivity of calcium-activated potassium channels in parasitized RBCs has been well established previously.⁶⁹ The basis of inhibition of host RBC potassium ion channels by the parasite can be theorized owing to the unlikeliness of 1071 residue parasitic protein to dimerize with the calmodulin-binding domain of ion channel. Instead of facilitating gating mechanism of the potassium ion channel, it is plausible that the parasite protein disables the proper functioning of the ion channel, thus, mediating host-cell rupture. The assessment measures, including interaction energy value of -30.1 kcal/mol and electrostatic complementarity of the modeled complex coupled with the evidences on subcellular localization⁷⁰ and abundant protein expression during schizont and merozoite growth stages of the parasite,²⁴ justify the credibility of the predicted host-parasite interaction.

Conclusion

Understanding the intricacies in the strategies acquired by a pathogen to remodel its host-cell machinery for successful colonization and persistence within the host requires understanding of protein–protein interactions across the host and the pathogen. In addition, the construction of protein interaction network for the pathogen can aid in the comprehension of local and global functional relationships within the pathogen, as described earlier,²¹ for the multihost parasite *P. falciparum*.

We have demonstrated the usefulness of structure-based approach integrated with various filters in recognizing 208 physicochemically viable protein-protein interactions across 30 host RBC proteins and 59 P. falciparum proteins. Integration of additional information pertaining to subcellular localization and protein expression profiles becomes a prerequisite to identify feasible RBC-parasite interactions, owing to the growth and development of the parasite in mature RBCs. The parasite proteins localized solely in cellular compartments, such as apicoplast, may not exhibit physical interaction with the host RBC proteins. Information on subcellular localization and protein expression is crucial especially for parasites such as P. falciparum, which reside in heterogeneous environmental conditions at different stages of their life cycle. This step aided in the extraction of RBC-parasite interactions in biological context and elimination of large number of interactions that are unlikely to occur in vivo. Indeed, the coverage on potential RBC-parasite interactions identified is limited by the availability of crystal structures of protein complexes. However, despite the limitations, our predictions provide an enriched list of potential players in P. falciparum that are capable of remodeling erythrocytes during infection.

Analyses on biological pathways and processes potentially influenced due to RBC-parasite interactions suggested a significant role played by parasitic proteins in cytoadherence of infected RBCs and immune evasion. Furthermore, the participation of conserved parasite proteins of unknown function in RBC-parasite interaction necessitates the recognition of structure and function for such proteins. We have also demonstrated rigorous means to analyze and evaluate the functional viability of a predicted interaction in terms of geometrical packing at the interfacial region, electrostatic complementarity of the interacting surfaces, and interaction energies. The RBCparasite protein-protein interactions, thus predicted, have the potential to warrant experimental endeavors in understanding probable mechanisms of pathogenesis.

Author Contributions

Conceived and designed the experiments: NS, PP, VN. Analyzed the data and contributed to the writing of manuscript: GR. Agreed with manuscript results and conclusions: NS, PP, VN, GR. Made critical revisions and approved the final version: NS. All authors reviewed and approved the final manuscript.

Supplementary Material

Supplementary Table 1. Details on probable interacting proteins across *P. falciparum* and host erythrocyte.

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