Single cell RNA-sequencing of malaria merozoites reveals that the parasite prepares

for life within the red blood cell by activating a gene network

Short title: Single cell RNA-seq of malaria merozoites

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Abstract

The intraerythrocytic developmental cycle (IDC) during which the malaria parasite *Plasmodium falciparum* multiplies asexually within the human host red blood cell is the symptomatic stage of the life cycle. The IDC initiates when parasite stages called merozoites are released into the bloodstream, following schizont rupture, and invade the host red blood cells. The merozoite is the less studied stage of the IDC, despite its importance for the establishment of infection. We did the first transcriptional profiling of merozoites throughout development inside the schizont and after egress. Merozoites within the schizont, activate a series of tightly regulated gene expression programs, each encoding for proteins implicated in a specific process required for invasion and life within the host. After schizont egress, free merozoites still express some of these programs. Upon invasion, ring cells have a distinct transcriptional profile. The gene expression programs are regulated by specific transcription factors and chromatin accessibility as well as post-transcriptional mechanisms. Our work gains unprecedent insight into gene expression prior to and during host cell invasion and identifies potential new antimalarial targets.

Author Summary

The malaria parasite *Plasmodium falciparum*, which causes the death of over half a

million people each year, has a complex life cycle but symptoms only arise when the parasite

invades and develops inside the host red blood cells. The merozoites are responsible for

invading the human red blood cells but because they are only briefly extracellular, their gene

expression profile had yet to be determined. Here we used single cell RNA-sequencing to

establish the gene expression program of merozoites throughout development inside

schizonts and once free, prior to host cell invasion. We found that, in order to prepare for

invasion and life within the host cell, merozoites activate a series of gene expression

programs, each encoding for proteins implicated in a specific process. While some of the

genes expressed by merozoites during maturation are still expressed in free merozoites, these

transcripts are no longer detected after host cell invasion. This implicates tight regulation of

gene expression. We suggest that regulation implicates binding of specific transcription

factors, epigenetics as well as post-transcriptional mechanisms.

Introduction

Malaria, responsible for over half a million deaths each year (1), is an infectious disease caused by the unicellular eukaryotic parasite *Plasmodium*. Out of the five species of parasite that cause disease in humans, *P. falciparum*, is the most virulent, causing the majority of the yearly over half a million deaths (WHO). The parasite life cycle is complex, alternating between the human host and the mosquito, that acts as both a host and a vector. The intraerythrocytic developmental cycle (IDC) (Fig 1A), in which the parasite multiplies within the human host red blood cell (RBC) for 48-hours, starts when parasite stages called merozoites, are released into the bloodstream, following schizont rupture, and invade the host RBC. Once inside the host cell, the parasite transforms into the ring stage. Some parasites exit the IDC and differentiate into the sexually committed cells, precursor of the male and female gametocytes, the transmission stages, that are uptake upon a mosquito bite.

The merozoite is the less studied stage of the IDC, despite its attractiveness as a drug target given that it is extracellular, even if briefly (2), it is responsible for RBC invasion, which is indispensable for parasite survival, and it initiates the IDC, which is the symptomatic life cycle stage of malaria.

Studies describing the transcriptional profiling of the different stages of the *P. falciparum* life cycle, lack information for the merozoite stage (3) and, until recently, it was thought that merozoites were transcriptionally silent (4). Here we establish for the first time the transcriptional signature of merozoites. We find that, during maturation inside the schizont, merozoites activate a succession of tightly regulated expression programs, allowing the parasite to later on express the proteins it needs to invade and survive within the RBC. After schizont exit, free merozoites still express a few of the genes activated during schizogony but, once the parasite invades the RBC and transforms into rings, the merozoites programs shut down and new programs turn on. Each of the merozoite expression programs encodes for proteins implicated in a specific process and we provide evidence that they are regulated by

specific transcription factors and epigenetic factors controlling chromatin accessibility as well

as post-transcriptional mechanisms.

Our comprehensive study of parasite gene expression before and after RBC invasion

further sheds light into gene expression in the malaria parasite and unfolds for the first time

the expression program allowing the parasite to invade the RBC and start the symptomatic

stage of the lifecycle.

Results

Merozoites express different sets of genes throughout development inside the schizont

In order to identify the transcription profile of merozoites during schizogony and after

schizont rupture, we adapted a protocol described before for the isolation of viable invasive

merozoites (5) (Fig 1B; S1A Fig). We synchronized parasites, and when schizonts were visible

in Giemsa-stained smears, we collected the culture. The culture also contained non-infected

RBCs, ring-stage parasites and free merozoites. We then passed the culture through a

magnetic column to retain the schizonts, which are magnetic due to the accumulation of

hemozoin, the end product of hemoglobin digestion. In the flow-through, we recovered the

non-infected RBCs, the ring stage parasites and the free merozoites. After elution from the

column, the schizonts were passed through a 1.2µM filter to release the merozoites inside.

The isolated merozoite and the flow-through cells were then prepared individually for single

cell RNA-sequencing. We obtained a high sequencing saturation and mapability to the

parasite genome and detected a similar number of genes in both samples (over 4800, ~90%

of the parasite genome) (S1 Table). Confirming that the purified merozoite cells are merozoite-

stage parasites, we detected expression of the merozoite marker *merozoite surface marker 1*

(*msp1*, PF3D7_0930300) but not of the ring marker *ring-exported protein 2* (*rex2*,

PF3D7_0936000) (S1B-C Figs). On the other hand, the majority of flow-through cells

expresses *rex2* (S1B-D Figs) and are therefore ring-stage parasites. Furthermore, we

detected less transcripts per cell in merozoite samples versus flow-through samples (S1E-F

Figs), in accordance with previous findings (3,6).

To analyze the heterogeneity of the merozoite expression programs we used Seurat,

a toolbox for quality check, analysis and visualization of single cell data (7–9). We identified

ten expression clusters (Fig 1C). Each cluster was characterized by expression of, on average,

49 distinct differentially expressed (DE) genes (S1G Fig; S2 Table). Clustering was

independent of the number of genes detected per cell or the cells RNA content (S1H Fig).

When we did gene ontology (GO) analysis, we found that each cluster expresses a specific

category of genes (Fig 1C; S2 Table). While clusters 5, 6 and 7 express genes related to host

cell invasion, in clusters 1, 8, 9 and 10 we detected genes related to nuclear processes, RNA

binding and protein synthesis. Clusters 2, 3 and 4 express genes encoding for proteins stored

in the dense granules that are later discharged and participate in events taking place post-

invasion - formation of the parasitophorous vacuole (PV), wherein the parasite resides after

invasion, formation of the *Plasmodium* translocon of exported proteins (PTEX) (10), in the PV

membrane, through which parasite proteins are exported into the host cell, and host cell

remodeling, allowing the parasite to import media nutrients.

Because some clusters are enriched for the same GO-terms, we compared them but

we found none to little overlap, except for clusters 5 and 6, related to invasion (Fig 1D; S1I

Fig). However, the invasion clusters 5 and 6 are different from the other invasion cluster,

cluster 7 (Fig 1D), and DE genes of a specific invasion cluster are overexpressed in that cluster

versus the other two invasion clusters (Fig 1E). Each merozoite cluster corresponds then to a

specific expression program.

Merozoites sequentially activate distinct gene expression programs during schizogony

Pseudotemporal analysis indicates that the merozoite cells, during schizogony, follow

one developmental trajectory marked by the sequential activation of each of the expression

clusters (Fig 2A; S2A Fig; S1 Table). The DE genes of a specific cluster are still expressed in

the next cluster but then few to none of those genes are detected in the afterwards cluster (Fig

2B), showing that expression of the genes of a given cluster peaks at a precise time. To

determine if the expression clusters correspond to transcriptional programs, we determined

how many of the DE genes of a cluster are transcribed by comparing our dataset to a

previously published list of genes actively transcribed throughout the IDC (6). Clusters 2, 3, 4,

6 and 7 likely correspond to transcriptional programs because over 50% of their DE genes are

actively transcribed during schizogony (Fig 2C).

Transcriptional programs are regulated by the binding of transcription factors to gene

promoters. The ApiAP2 DNA-binding proteins are the main family of transcription factors in

the parasite (11). The ApiAP2 proteins AP2-I, AP2-LT and AP2-EXP and the bromodomain

protein BDP1 have been linked to expression of invasion genes (12–15) so we determined if

the genes of the invasion transcriptional programs, clusters 6 and 7, are regulated by these

proteins. AP2-I and associated proteins, regulate the cluster 7 program because 88% of the

gene promoters in this cluster are bound by AP2-I, BDP1, AP2-LT or a combination of the

three proteins (Figs 2D-E). That is not the case for the cluster 6 genes (Fig 2D) so to identify

the DNA-binding proteins regulating transcription of this and the other three transcriptional

programs, we searched for enrichment of DNA sequence motifs in the promoters of the DE

genes. We identified two DNA motifs, one enriched in the promoters of clusters 3 and 6 genes,

that we named merozoite DNA motif 1, and one enriched upstream of clusters 2 and 4 genes,

here named merozoite DNA motif 2 (Fig 2F). A *cis*-regulatory element very similar to

merozoite DNA motif 1 was previously identified *in silico* (16) indicating that DNA motif 1 is

frequently found in gene promoters. The parasite repressor ApiAP2 protein AP2-G2 (17,18)

binds to a DNA motif similar to merozoite DNA motif 1 (S2B Fig) so we examined if the gene

promoters of clusters 3 and 6, containing the merozoite DNA motif 1, are AP2-G2 ChIP-Seq

targets and found that about half are (S2C Fig), suggesting that AP2-G2 may repress

transcription of the DE genes in these clusters. Comparison of merozoite DNA motif 2 with the

DNA motifs bound by the ApiAP2 proteins (11) indicate that the uncharacterized ApiAP2

protein PF3D7_1239200 may bind to it (S2D Fig).

Clusters containing genes enriched for the same merozoite DNA motif are expressed

at different pseudotimes. We wondered if this reflects different times of chromatin opening at

the promoter regions allowing protein binding earlier or later post-invasion. We thus

determined when the promoters of each of the clusters was euchromatic by comparing our

gene list to a published ATAC-Seq data (19). The order of activation of the transcription

clusters 2, 3, 4, 6 and 7 is linked to the timing of chromatin opening because a larger proportion

of gene promoters of later expressed clusters is euchromatic at 40hpi (Fig 2G).

Our analysis indicates that clusters 1, 5, 8, 9 and 10 are not actively transcribed (Fig

2C) so we wondered if the transcripts detected in these clusters are stabilized. To do that, we

determined how many of these clusters genes have been previously labelled as stabilized (6).

The majority of the transcripts detected in cluster 5, but not clusters 1, 8, 9 and 10, are

stabilized (Fig S2E). However, there is no correlation between the order in which clusters 1,

8, 9 and 10 are expressed and the timing of chromatin opening (Fig 2G). Given that the genes

expressed in cluster 5 are stabilized and the genes expressed in clusters 1, 8, 9 and 10 are

not expressed when most promoters are euchromatic, their regulation is likely post-

transcriptional and it is mediated by RNA-binding proteins. Sequence enrichment analysis

identified distinct motifs in the 3' untranslated regions (3'utr) of the clusters 1, 5, 8, 9 and 10

DE genes (S4 Table). The RNA-binding protein PF3D7_0823200 binds similar motifs to those

identified in the 3'utr of clusters 5, 8 and 9 genes (20,21) (S2F Fig) but few genes in these

clusters are bound by the protein (S2G Fig). The motifs found in the 3'utr of clusters 1 and 10

genes resemble those bound by two putative RNA-binding proteins that remain unstudied

(S2F Fig).

The invasion clusters 5 and 6 have virtually identical chromatin opening patterns (Fig

2G) and, as for cluster 6, the merozoite DNA motif 1 is present in the promoters of cluster 5

genes (S2H Fig) and AP2-G2 binds to the gene promoters (S2C Fig), suggesting that

regulation of the invasion clusters 5 and 6 involves the same proteins.

To establish if there is variation in expression of the merozoite programs in merozoites

within a same schizont or all merozoites inside a schizont express the same genes, we

quantified which of the clusters have genes with a high variability index score (VIS), a metric

established by Tripathi *et al.* to identify genes with high merozoite-to-merozoite variation in

mature schizonts (22). Over half of the merozoite clusters 3 and 4 genes, encoding for proteins

implicated in host cell remodeling, and 80% and 69% of the genes in the invasion clusters 5

and 6, respectively, have a VIS>1 (S2I Fig; S2 Table), suggesting that expression of these

particular expression programs is stochastic.

Parasites activate different transcriptional programs post-invasion

We performed single cell RNA-Seq on flow-through cells to identify the transcriptional

programs expressed by the parasite after schizont rupture. We identified 8 expression

clusters, each characterized by the expression of a specific set of genes (Fig 3A; S3A-B Figs;

S3 Table). GO-term analysis of the marker genes of each cluster (S3 Table) reveals that three

clusters (3, 6 and 7) express genes coding proteins implicated in the formation of the Maurer's

cleft, parasite structures from which the exported parasite proteins are sorted and transported

to the host cell (Fig 3A) but we did not find any overlapping genes (S3 Table), suggesting that

each cluster is a separate expression program. Cluster 1 expresses the *var* genes encoding

for Erythrocyte Surface Protein 1, implicated in antigenic variation (Fig 3A), and cluster 2

genes code for proteins implicated in sexual commitment (Fig 3A). Apart from cluster 0, which

is specialized in host interaction and motility (Fig 3A) and will be discussed later, we believe

that these clusters correspond to expression programs expressed by ring-stage parasites

because these are the predominant stages in the flow-through, as previously discussed, and

they match previous findings (3).

Most parasites in the parasite culture collected for magnetic purification were schizont

stages so there are few cells in each flow-through cluster (S1 Table). To ensure that this did

not bias our results, we sequenced and analyzed flow-through cells coming from a second

magnetic purification, containing more ring-stage parasites, and identified the same

expression programs (S3C-D Figs; S3 Table).

Pseudotemporal analysis suggest that, after RBC invasion, early ring stage parasites

are already committed to pursue the IDC by expressing cluster 1 or express instead cluster 2

and commit to sexual differentiation (Fig 3B; S3E Fig).

Unlike the merozoite clusters, all the ring expression clusters seem to correspond to

transcriptional programs because the majority of all clusters DE genes, except for cluster 7, is

actively transcribed during the IDC (Fig 3C). Regulation of the ring expression clusters is thus

likely mediated by the binding of specific transcription factors to the gene promoters. The time

at which the chromatin at the promoter regions of the genes is accessible correlates somehow

with the progressive activation of the clusters (S3F Fig). As expected, the sexual commitment

transcriptional program corresponding to cluster 2 is regulated by AP2-G, the parasite

gametocytogenesis master regulator (23) (Fig 3D). Motif enrichment analysis shows that there

are different DNA motifs in the promoters of the genes expressed in the other clusters and

indicate, for instance, that the ApiAP2 protein PF3D7_0613800 may regulate the cluster 6

genes (S3G Fig; S4 Table). PF3D7_0613800 remains uncharacterized but it is essential for

parasite growth (24).

We examined if there was any correlation between the transcriptional programs

expressed by merozoites and ring stage cells. Merozoite and ring stage cells both express

genes encoding for nuclear proteins or proteins implicated in host cell remodeling but the

merozoites and ring expression programs are distinct because there is no overlap between

the genes expressed by the two types of cells (S2 and S3 Tables). This implies that the

merozoite expression programs cease after RBC invasion.

Free merozoites express host cell invasion and remodeling genes

We noticed that the cluster 0 of flow-through cells is excluded from the pseudotemporal

trajectory (Fig 3B). Furthermore, cluster 0 cells contain a lower amount of RNA (S3B Fig) and

the genes expressed in cluster 0 are transcribed at the end of schizogony (1/48hpi) (Fig 4A).

This led us to ponder if these cells are free merozoites that egressed from schizonts before

we collected the parasite culture and did the magnetic purification. To test this hypothesis, we

combined the data from the merozoite and ring cells and filtered the cells, using the same parameters we used for the ring cells, to only select for late stage merozoites. Then we identified the genes that were over-expressed or down-expressed in the merozoites versus the ring cells (Fig 4B). Genes over-expressed in merozoites represent the late stage merozoites transcriptional signature. We found 25 genes over-expressed in merozoites (S5 Table), coding for proteins implicated in host cell invasion and host cell remodeling (S4A Fig). Confirming that cluster 0 cells are indeed free merozoites, over 60% of the genes expressed in cluster 0 are part of the late stage merozoites transcriptional signature (Fig 4C). Cluster 0 then represents the transcriptional profile of free merozoites, an elusive stage that had never before been captured by transcriptional studies.

We determined which of the genes expressed by merozoites during schizogony are still detected in free merozoites. Marker genes of merozoite clusters 2, 3, 4, 5, 6 and 7 encoding for genes implicated in host cell remodeling, vacuole formation, motility and invasion are detected in both late stage merozoites and cluster 0 (Fig 4D), indicating that these genes are still expressed in free merozoites. Supporting this, the merozoite DNA motif 1, which we previously showed is present in the promoters of merozoite clusters 3, 5 and 6, is also present in the promoters of genes expressed in free merozoites (S4B Fig). Whereas more than 60% of the invasion merozoite clusters 5 and 6 are still expressed in free merozoites, only 5% of the invasion merozoite cluster 7 genes are (Fig 4D). This, together with the fact that the genes expressed in free merozoites are not regulated by AP2-I and associated proteins (S4C Fig), indicate that only the non-AP2-I merozoite invasion transcriptional program remains active in free merozoites.

Discussion

Merozoites are responsible for RBC invasion and initiate the symptomatic phase of the malaria life cycle but they are the less transcriptionally understood stage of the IDC. Our data shows that there are rapid changes in gene expression during formation and segmentation of

merozoites (Fig 4E). Merozoites express genes encoding nuclear proteins and proteins

destined to the dense granules as well as gene products implicated in host cell interaction, PV

formation, invasion and motility allowing infection of new RBCs. There is also a merozoite

program dedicated to expression of genes encoding for proteins implicated in RNA-binding

and translation. Free merozoites still express the PV and host cell remodeling programs as

well as genes implicated in motility and host interaction. All of the merozoite expression

programs shut down once the parasite invades the host cell and transforms into the ring-stage.

Around 40% of the parasite genome remains unannotated (25) because there are

either no recognizable functional domains or it is unknown if the annotated domains are

functional. The merozoite program with the higher percentage of unknown genes is cluster 10,

specialized in ribosome assembly (S4D Fig). Our study can be used to discover new proteins

implicated in this process as well as in vacuole formation, host cell remodeling and others.

Moreover, the genes expressed by merozoites do not have, for the most part, human

orthologues (S4E Fig), making them interesting from a therapeutic point of view.

The gene expression cascade controlling merozoite formation and maturation we

identified here implies that gene expression at this stage of the parasite life cycle is tightly

regulated. This resembles the developmental gene networks of other organisms (26) where a

cascade of transcription factors activates expression of proteins that repress translation of

other proteins. We propose that regulation of gene expression during merozoite maturation

inside schizonts is transcriptional, involving binding of proteins to specific DNA motifs in the

gene promoters, once the chromatin is accessible, and post-transcriptional. On the other hand,

regulation of gene expression in ring-stage parasites is mainly transcriptional. This is in

accordance with previous studies that found that, at the final stages of schizogony, there is

increased expression of RNA-binding proteins and gene expression is mainly the

consequence of RNA stabilization, while expression during ring-stage parasites is linked to

active transcription (6,27,28).

292  We could show that the genes expressed in the merozoite invasion cluster 7 are

293 regulated by AP2-I, BDP1 and AP2-LT while the genes expressed in the merozoite invasion

294 cluster 6 are not bound by these proteins. The genes of cluster 6 contain, instead, in their

295 promoter region, a DNA motif here called merozoite DNA motif 1. The merozoite DNA motif 1

296 is also present in the promoters of the invasion cluster 5, suggesting that there are two invasion

297 transcriptional programs, one corresponding to cluster 7, regulated by AP2-I and associated

298 proteins, and another one, corresponding to clusters 5 and 6, regulated by other, yet to be

299 determined regulators. Previous to our work it was known that AP2-I only bound a subset of

300 invasion-related genes (12) but it was believed that all invasion-related genes were activated

301 at the same time. Here we show that the AP2-I invasion transcriptional program shuts down

302 as the merozoites egress schizonts while the non-AP2-I transcriptional program remains

303 active. Thus, unlike what was previously believed, expression of some invasion genes

304 continues after schizont rupture (6,29–31). These are the genes coding for proteins implicated

305 in the later steps of invasion, such as host receptor interaction, motility and penetration (12),

306 rather than RBC recognition and attachment. Another difference we found between the two

307 invasion transcriptional programs is that the only the non AP2-I program seems to be

308 stochastic (VIS>1), which is supported by the fact that the chromatin opening pattern of the

309 genes in this program is remarkably uniform compared to that of clusters 5 and 6.

310  Other genes contain in their promoter the merozoite DNA motif 2, which may be bound

311 by the ApiAP2 protein PF3D7_1239200. This protein has recently been detected as part of

312 the parasite MORC complex (32) but it remains uncharacterized. We detected expression of

313 other ApiAP2 proteins as well as RNA-binding proteins throughout merozoite development

314 (S1 Table) but further studies are needed to determine which of these are implicated in

315 regulation of the merozoite expression programs.

316  The gene network we uncovered can serve as a reference to understand gene

317 expression regulation mechanisms implicated in the establishment of malaria infection and to

318 better understand the complex parasite life cycle.

Materials and Methods

Parasite culturing and merozoites purification

P. falciparum W2mef parasites were cultured at 37°C in the presence of 5% oxygen and 5% carbon dioxide, in RPMI 1640 media (Fisher) supplemented with hypoxanthine and 0.5% Albumax II (Invitrogen) in 2% hematocrit. Blood was obtained from the Etablissement Français du Sang (EFS).

Parasite synchronization to the ring stage was done two consecutive cycles by incubating pelleted cultures 1:1 with 0.3M L-Alanine, 10mM HEPES pH 7.5 solution for 10 min at 37°C(33), after which cultures were centrifuged, resuspended in fresh media and placed back in culture.

A mixed culture of non-infected RBCs, schizonts, rings and free merozoites was passed through LD columns (Miltenyi Biotec). The flow-through, corresponding to ring stage parasites, free merozoites and non-infected red blood cells, was recovered. The schizonts were eluted from the column with RPMI 1640 (Fisher) and then passed through a 1.2μm filter attached to a 10ml syringe to release the merozoites inside as described in(5). This corresponds to the merozoite fraction.

The purity of each fraction was verified by Giemsa-stained blood smear.

Parasites were counted with a Neubauer chamber and diluted with 1XPBS/0.04%BSA to 1 million cells/ml.

Single cell RNA-Sequencing

Approximately 10.000 cells (merozoites or flow-through) were loaded on a Chromium Chip G (10x Genomics) as per the manufacturer's recommendations. Chips containing cell suspensions, gel beads in emulsion (GEMs) and reverse transcription reagents were loaded into the chromium controller (10x Genomics) for single cell partitioning and cell barcoding. Barcoded cDNA and sequencing libraries were generated according to the Chromium Next GEM Single Cell 3' gene expression v3.1 protocol. Quantification and the quality of

sequencing libraries was verified on an Agilent Bioanalyzer. Pooled libraries were sequenced

on a NextSeq 2000 system (Illumina).

Data analysis

Quality control checks on the raw sequencing data were performed using FASTQC (Andrews,

2010). FastQ files were analyzed using the CellRanger software (10X Genomics), including

alignment, filtering and quantitation of reads on the *Plasmodium falciparum* genome (3D7)

and generation of feature-barcode count matrices. During mapping, the reads corresponding

to the human host cell were discarded.

Genes detected in fewer than three cells were removed. Cells with more than 0.5% of

mitochondrial genes were removed. Cells with fewer than 30 genes and more than 1500 genes

per cell and less than 100 reads per cell were removed from merozoites. This threshold was

chosen because a previous single cell data (22) had shown that schizonts express an average

of 1040 genes, which for a schizont producing 30 merozoites, represents 34 genes per

merozoite assuming all merozoites express the same number of genes. Cells with fewer than

200 genes and more than 2500 genes per cells were removed from rings and merozoites

(when compared to rings).

The Seurat toolbox version 4.3.0.1 was used to normalize each dataset using SCTransform

(34) and cluster the cells. Visualizations and identification of differentially expressed genes

were done using the Loupe browser (10X Genomics, version 7).

Pseudotime was calculated using Monocle3 R package (35) to organize the merozoite and

ring cells.

Motif enrichment analysis was done using STREME(36) to identify enriched motifs in the 5'utr

regions (downloaded from PlasmoDB) as compared to scrambled sequences of similar length.

TOMTOM(37) was used to compare the *de novo* discovered motifs to previously *in silico*

discovered motifs(11). Only motifs found in STREME that were not a series of A and T were

considered given the enrichment of these nucleotides in the parasite genome.

The ATAC-Seq analysis were done by comparing the genes expressed in each cluster to

those identified in (19). We chose this particular ATAC-Seq dataset because peaks are labeled

as hpi instead of parasite stage like in (38).

The transcription versus RNA stability analysis were done by comparing the genes expressed

in each cluster to those labelled as transcribed or stabilized in (6).

The ChIP-Seq analysis were done by comparing the genes expressed in each cluster to the

target genes identified in (12,15,39),(18). Whenever ChIP-Seq data was available from

multiple sources, we filtered out target genes only found in one of the subsets.

To determine if the cells recovered in the second magnetic purification flow-through express

the same expression clusters as the ones recovered in the first purification flow-through, we

looked for cells expressing DE genes of each of the flow-through clusters and then manually

identified as belonging to that certain cluster.

Venn diagrams were generated using the online tool BioVenn.

Gene Ontology (GO) enrichment analysis was done using the GO feature at PlasmoDB (25).

Orthologue searches were done using OrthoMCL (40).

Data availability

All RNA sequencing data generated in this study will be available in the peer-reviewed

versoon.

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Authors contribution

Conceptualization: JMS

Parasite culturing: LP, JMS

Single cell experiment: YJ

Data analysis: DN, CH, JMS

Writing: JMS

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Competing interests

The authors declare no competing interests

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Figure 1

Figure 1 – **During schizogony merozoite cells express different sets of genes. A** During the intraerythrocytic developmental cycle (IDC), lasting 48 hours, parasite forms called merozoites egress from schizonts and invade the red blood cell (RBC) to become ring cells. Parasites either sexual commit, eventually differentiating into gametocytes, or continue the IDC, transforming into schizonts, within which new merozoites are formed (numbers below each stage indicate hour post-invasion, hpi). **B** The parasite culture used contained 10% infected RBCs, corresponding to 90% schizont-stage parasites, 9.9% ring-stage parasites and 0.1% free merozoites. To obtain single cell RNA-seq data from merozoites and flow-through cells, independently, schizonts were purified from the culture by magnetic purification and then the merozoites inside were released by filter passage. In the flow-through, we collected the non-infected RBCs, the ring-stage parasites and the free merozoites. **C** UMAP representation showing the merozoite cells grouped by expression cluster (the number of cells in each cluster is in Supplementary Data 1). Gene ontology (GO) analysis of the genes differentially expressed (DE) in each merozoite cluster shows that each cluster expresses genes encoding proteins implicated in different processes. Cell and bar graphs are colored according to the corresponding cluster. Only the most significant GO-terms are shown. For the complete GO-term analysis, check Supplementary Data 2. A heatmap showing expression of 100 randomly selected genes in the 10 clusters is in Supplementary Fig. S1G. The distribution of the number of genes/UMIs per cell in each cluster is in Supplementary Fig. 1H. **D** Comparison of clusters enriched for the same GO-term. There is little overlap between invasion clusters 6 and 7 or 5 and 7 but invasion clusters 5 and 6 are similar. Clusters 8 and 10 (enriched for GO-term RNA binding) are not similar. Circles are colored according to the corresponding cluster. Comparison of other clusters is in Supplementary Fig. 1I. **E** DE genes of the invasion clusters 5, 6 and 7 are significantly overexpressed in that cluster compared to the others. Violin plots are colored according to the set of DE genes analyzed. Differences between values were evaluated by an unpaired t-test. **** P < 0.0001.

Figure 2

Figure 2 – **Merozoites go through a transcriptional cascade during schizogony. A**. UMAP projection and pseudotemporal analysis of the merozoite clusters showing that clusters are expressed sequentially. The cells pseudotime is in Supplementary Data 1 and the clusters pseudotime is in Supplementary Fig. S2A. **B**. Genes are still detected in the next cluster (c+1) but in the cluster afterwards (c+2) detection diminishes or is absent. Bars are colored according to cluster. **C**. Comparison of the genes expressed in each cluster with published data establishing which genes are actively transcribed or stabilized during the IDC[5] find that over 50% of genes of clusters 2, 3, 4, 6 and 7 are actively transcribed. **D**. Only the invasion genes expressed in cluster 7 are ChIP-Seq targets of AP2-I, BDP1 or AP2-LT[11-14]. **E**. The majority of genes expressed in invasion cluster 7 are ChIP-Seq targets of AP2-I (pink), BDP1 (blue) or both (orange). **F**. STREME analysis showing that a DNA motif, here called merozoite DNA motif 1, is present in the promoter region of the DE genes of clusters 3 and 6, while in clusters 2 and 4 gene promoters, there is merozoite DNA motif 2. E-value and Scores indicate the significance of the found DNA motif. The DREME and TOMTOM analysis are in Supplementary Data 4. **G**. Comparison of the genes expressed in each cluster with published ATAC-Seq data[17] shows that the pseudotemporal progression of the actively transcribed clusters (2, 3, 4, 6 and 7) concurs with the sequence of chromatin accessibility, with 84% of cluster 7 genes being euchromatic at 40hpi while 86% of cluster 2 genes are euchromatic at 5-35hpi. There is no concordance between pseudotime and chromatin accessibility in the non-actively transcribed clusters (1, 5, 8, 9 and 10), except for cluster 5. The indicated times correspond to the earliest assigned ATAC-Seq peak. The ATAC-Seq analysis is in Supplementary Data 2.

Figure 3

Figure 3 – **The merozoite genes are not expressed after invasion**. **A**. UMAP representation showing the flow-through cells grouped by expression cluster (the number of cells in each cluster is in Supplementary Data 1). According to GO-term analysis of the DE genes of each cluster, these cells express genes implicated in host cell remodeling, nuclear processes, antigenic variation, invasion or sexual commitment. There were not enough DE genes in clusters 4 and 5 to perform GO-term analysis. Because there is no GO-term associated with gametocytes, word search analysis was done instead for cluster 2 genes. Bar graphs are colored according to the corresponding cluster. Only the most significant GO-terms are shown. The full list of GO-terms and words is in Supplementary Data 3. A heatmap showing expression of 100 randomly selected genes in the 8 clusters is in Supplementary Fig. 3A. The distribution of the number of genes/UMIs per cell in each cluster is in Supplementary Fig. 3B. **B**. UMAP projection and schematic of the pseudotemporal ordering of the ring clusters showing that ring cells either commit to sexual development and express cluster 2 or go on to express the antigenic variation genes. Numbers indicate expression clusters. The cells pseudotime is in Supplementary Data 1 and the clusters pseudotime is in Supplementary Fig. 3C. **C**. Comparison of genes expressed in each cluster with published transcription data[5] found that over 50% of the genes expressed in all clusters, except cluster 7, are actively transcribed between 1 and 20hpi (rings developmental timing). **D**. The DNA-binding motif of AP2-G is enriched in the promoter of cluster 2 genes and a majority of these cluster genes are AP2-G ChIP-Seq targets[22]. The ChIP-Seq analysis are in Supplementary Data 3. The DNA motifs enriched in the promoters of the other clusters genes is in Supplementary Fig. 3D.

Figure 4

A

B
overexpressed in merozoites
downexpressed in merozoites
EBA-175
MSP1
RH1

C
cluster 0

D
Overlap with late stage merozoites
Overlap with cluster 0

E
merozoites maturation

Ring

Free merozoites

Invasion

Sexual Ring

Figure 4 – **Transcriptional signature of free merozoite cells**. **A**. The majority of genes detected in cluster 0 of flow-through cells are actively transcribed at 1/48hpi. **B**. Volcano plot showing that invasion genes, such as *msp1*, *eba-175* and *rh1* are overexpressed in late merozoite cells versus ring cells. There was only one gene overexpressed in rings. The full list of genes and GO-term analysis are in Supplementary Data 5. **C**. The majority of genes overexpressed in late merozoite cells is detected in cluster 0 cells. **D**. Merozoite clusters 3, 5 and 6 are still expressed in free merozoites since over 50% of those cluster genes are detected in late stage merozoites and in cluster 0 cells. **E**. Scheme of the merozoites transcriptional cascade and progression of gene expression upon schizont rupture, in free merozoites, and after host cell invasion, in ring-stage cells.