Single cell expression profile of the human malaria intracellular, extracellular and

sexual merozoites

Short title: Single cell expression atlas of the human malaria merozoites

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Abstract

The intraerythrocytic developmental cycle (IDC) during which the malaria parasite *Plasmodium falciparum* multiplies asexually 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 performed the first gene expression profiling of individual merozoites throughout development inside the schizont and after egress. This allowed us to identify for the first time the specific gene signatures of free merozoites, early and late stage intracellular merozoites. We also identified an earlier state of sexual commitment, preceding expression of the gametocytogenesis master regulator *ap2-g*.

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. We also identified for the first time the gene signature of sexually-

committed and sexual merozoites that will later give raise to gametocytes and ensure parasite

transmission.

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, invade the host RBC. After invasion, the parasite transforms into the ring stage and ~20 hours post-invasion (hpi) into trophozoites. At ~30 hpi, new invasive forms called merozoites are formed inside schizonts by schizogony. At the end of the IDC, 30-32 merozoites are released into the bloodstream (2). In *P. falciparum*, the IDC ensures parasite multiplication but also transmission because parasites must undergo at least one IDC in order to sexually commit and form gametocytes that are later transmitted to the mosquito vector (3) (Fig 1A). Sexual commitment only occurs in a small subset of cells and it is triggered by the expression of the gametocyte master regulator AP2-G, a transcription factor (4,5).

The merozoite is the less studied stage of the IDC, despite its attractiveness as a drug target given that (i) it is extracellular, even if briefly (6); (ii) it is responsible for RBC invasion, which is indispensable for parasite survival; and, (iii) it initiates the IDC, which is the symptomatic life cycle stage of malaria. Studies describing the gene expression profiling of the different stages of the *P. falciparum* life cycle, lack information for the merozoite stage (7) and, it is only recently that it was shown that merozoites are transcriptionally active (8). RBC invasion is a fast process, lasting ~1 minute (9), and merozoites only last 5-15 minutes extracellular (10), so when the newly formed merozoites egress from schizonts, they must be already equipped with all the proteins they need to find and invade new RBCs. The genes encoding those proteins should then be transcribed before, during merozoite maturation inside schizonts. However, this hypothesis remains to be confirmed.

Here we used single cell RNA-sequencing to establish for the first time the gene expression signature of *P. falciparum* merozoites during schizogony and upon schizont rupture. We find that, during maturation inside the schizont, merozoites express nuclear, RNA-binding and translation-related encoding genes, as well as invasion and host cell remodeling genes. After schizont exit, we still detect these transcripts in free merozoites. We also identify for the first time sexually committed merozoites that will later give raise to gametocytes and ensure parasite transmission.

Our comprehensive study of parasite gene expression of the malaria merozoites further sheds light into gene expression in the malaria parasite and unfolds for the first time the single cell expression atlas of the human malaria merozoites, allowing the parasite to invade the RBC.

Results

Single cell RNA-sequencing of merozoite cells

In order to identify the gene expression profile of the malaria merozoites, we adapted a protocol described before for the isolation of viable invasive merozoites (10) (Fig 1B). The parasite culture was passed through a magnetic column to retain the schizonts, which are magnetic due to the accumulation of hemozoin, the end product of hemoglobin digestion. The purified schizonts were then passed through a 1.2µM filter to release the merozoites inside. Using this method, we could purify merozoites from schizonts as early as 32 hpi (S1A-B Figs).

To recover intracellular merozoites, as well as free merozoites, we single synchronized parasites for two cycles, and when schizonts were visible in Giemsa-stained smears (S1C Fig), we collected the culture. Because the culture was not tightly synchronized, it also contained non-infected RBCs, ring-stage parasites and free merozoites (S1C Fig). These cells are not retained by the magnetic column and were then recovered in the flow-through of the magnetic purification. The purity of each fraction was verified by Giemsa-stained blood smears

(S1D-E Figs). The merozoite and the flow-through fractions were prepared separately for

single cell RNA-sequencing using the 10X Genomics technology.

We obtained sequencing data for 1580 isolated merozoite cells and 405 flow-through

cells (S1 Table). To obtain a similar number of cells in each fraction, we sequenced flow-

through cells coming from a second magnetic purification of a second parasite culture

containing more rings and free merozoites and less schizonts (Fig 1B). We obtained a total of

1464 cells in the combined flow-through fractions (S1 Table). We acquired a similar number

of reads (over 200 million), obtained a high percentage of sequencing saturation (over 96%)

and detected a similar number of genes (over 4800, ~90% of the parasite genes) for the cells

in the merozoite and flow-through fractions (S1 Table). Smaller cells have less total

messenger RNA (11) and we detected about ten times less transcripts per cell of the merozoite

fraction than per cell of the flow-through fraction (S1F-H Figs), in accordance with previous

studies (7,12). For this reason, whereas for the flow-through samples, we filtered out cells with

fewer than 200 genes and over 2500 genes per cell, a common threshold to analyze *P.*

falciparum single cell data, we used a different filter for the merozoite fraction. We excluded

from the merozoite fraction, cells with fewer than 30 genes and more than 2500 genes per cell

and less than 80 reads per cell. Similar parameters were used to analyze *P. berghei*

merozoites (7). After filtering, we retained 968 cells in the merozoite fraction and 1421 cells in

the combined flow-through fractions (S1 Table).

Identification of free merozoites

To ensure that the cells collected in the merozoite fraction are in fact merozoite-stage

parasites, we determined if these cells express known merozoite genes. Merozoite surface

protein 1 (MSP1) is the most abundant merozoite surface protein (13) and the encoding gene

(PF3D7_0930300) is over-expressed in merozoite cells versus ring cells, as determined by

Reers *et al*. (8) that defined a list of genes that are over-expressed in merozoite cells versus

rings and schizont cells. We thus used *msp1* as a merozoite marker. *msp1* is expressed by

the merozoite fraction cells and these cells do not express the ring marker *ring-exported*

protein 2 (*rex2*, PF3D7_0936000) (Fig 2A and S2A Fig). On the other hand, the majority of

flow-through cells expresses *rex2* (Fig 2A and S2A-B Figs) and are therefore ring-stage

parasites. Moreover, 59% of the genes expressed by the merozoite fraction cells encode for

proteins identified as part of a merozoite proteome (14) (Fig 2B) and, with one exception, none

of the genes expressed in merozoite cells were previously found by (8) to be over-expressed

in schizonts versus merozoite cells (Fig 2B, S2 Table). 38% and 47% of the genes expressed

by the merozoite cells were also previously shown by (8) to be over-expressed in merozoites

versus ring and schizont stage cells, respectively (Fig 2B, S2 Table).

Having established that the merozoite fraction corresponds to merozoites produced

during schizogony, we wanted to identify free, extracellular merozoites. These egressed from

schizonts before we did the magnetic purification and were collected in the flow-through. Free

merozoites and ring-stage cells, corresponding to 89% of the cells in the flow-through fraction

(Fig 2A), are expected to express different genes so we used Seurat, a toolbox for quality

check, analysis and visualization of single cell data (15–17), to identify a cell cluster, in the

flow-through fraction, corresponding to the free merozoites. We identified eight expression

clusters for the flow-through cells (S2C-D Fig). Differential expression analysis was done to

determine which genes are differentially expressed in one particular cluster versus the others.

These genes are herein called marker genes. Gene ontology (GO) analysis of the marker

genes of each flow-through cluster shows that cluster 0 cells express genes specialized in

host entry and motility (Fig 2C, S2 and S3 Tables), functions associated with invasion and so

with merozoites. As expected from merozoite cells, the cluster 0 cells also contain less RNA

than other flow-through cluster cells (S2E Fig). This indicates that the cluster 0 cells represent

the gene expression profile of free merozoites. We identified 66 free merozoite cells in the two

flow-throughs, corresponding to less than 5% of the population, as expected from an elusive

stage that had never before been captured by RNA-sequencing studies.

Gene expression signature of intracellular merozoites throughout schizogony

To identify the gene expression signature of intracellular merozoites, we applied

Seurat to the cells collected in the merozoite fraction of the magnetic purification. We identified

ten merozoite clusters (Fig 3A, S3A Fig). Clustering was independent of the number of genes

detected per cell or the cells RNA content (S3B Fig) and each merozoite cluster is

characterized by expression of, on average, 49 distinct marker genes (S2 Table).

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

developmental trajectory (S3C Fig), as anticipated, since all merozoites egress and invade

RBCs. About half of the marker genes of each merozoite cluster encode for unknown or

putative proteins (S3D Fig), which is not unexpected since about 30% of the parasite proteins

remain unannotated (18). Despite this, in all clusters, the most differentially expressed genes

encode known proteins (S2 Table) so we did GO-term analysis of the annotated genes to

assign a label to each merozoite cluster. This analysis show that each cluster is characterized

by the expression of a specific category of marker genes (Fig 3B; S2 Table). While clusters 5,

6 and 7 express marker genes related to host cell invasion, clusters 1, 8, 9 and 10 marker

genes are related to nuclear processes, RNA binding and protein synthesis. Clusters 2, 3 and

4 express marker 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), 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 of the merozoite 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 (S3E Fig). However, the invasion clusters 5 and 6 are different from the

other invasion cluster, cluster 7 (S3E Fig), and marker genes of a specific invasion cluster are

over-expressed in that cluster versus the other two invasion clusters (S3F Fig).

Since the culture used for the single cell RNA-sequencing was not tightly synchronized

and magnetic purification followed by syringe filter allows extraction of merozoites from as

early as 32hpi, it is likely that we captured, in the merozoite fraction, merozoites going through

schizogony (30-48 hpi). To examine this, we calculated the pseudotime of the different

merozoite clusters and found that a different pseudotime is attributed to each cluster (Fig 3C;

S1 Table). We also compared our results to a published real-time expression data (19) to

determine the time of peak transcription and stability of the marker genes of each cluster and

find that not all genes reach peak transcription or stability at the same time (S3G Fig; S2

Table). Interestingly, the clusters 8, 9 and 10 marker genes, encoding RNA-binding and

translation proteins, reach peak transcription between 12hpi and 30 hpi, so during the ring and

trophozoite stages, and reach peak stability between 18 and 30 hpi, at the trophozoite stage

(S3G Fig; S2 Table). Moreover, they are more expressed by ring cells than by merozoites

(S3H Fig, S2 Table) according to Reers *et al.* (8). That is not the case of the marker genes of

the other clusters (S3H Fig; S2 Table). This indicates that these marker genes, while

expressed by merozoites, continue to be expressed afterwards during ring development. All

of these observations suggest that we collected, in the merozoite fraction, intracellular

merozoites of different ages. To test this experimentally, we did single cell RT-qPCR on

individual merozoites collected at three different time points (32 hpi, 42 hpi and 47hpi) (S3I

Fig). We selected 10 marker genes that reach peak expression in a specific cell cluster (Fig

3D) and designed primers for 7 of the genes (S4 Table): *hsp70* (PF3D7_0818900), cluster 1

marker gene; *bdp2* (PF3D7_1212900), cluster 2 marker gene; *eba-175* (PF3D7_0731500),

cluster 5 marker gene; *gap45* (PF3D7_1222700), cluster 6 marker gene; *msp1*

(PF3D7_0930300), cluster 7 marker gene; and *60S L4* (PF3D7_0507100), cluster 9 marker

gene. The other 3 genes were determined to be too small or difficult to amplify. For each

merozoite (Fig 3E), we quantified expression of two marker genes and scored whether

merozoites expressed only one of the marker genes, none of the marker genes or over-

expressed one of the transcripts versus the other. We also quantified expression of a transcript

previously used as reference for RT-qPCR assays (20) and we only considered cells in which

we detected transcription of the reference gene. The percentage of cells only expressing one

gene or overexpressing that gene versus another varies, with time, for all the genes pairs we

compared (Fig 3E). For instance, cells over-expressing the cluster 1 marker gene versus the

cluster 7 marker gene are already detected at 32 hpi, whereas cells over-expressing the

cluster 7 marker gene versus the cluster 1 marker gene only start being detected at 42 hpi

(Fig 3E, S4 Table). These results show that the different marker genes reach peak expression

at different time points and so that we collected merozoite cells throughout development.

Identification of specific merozoite types

The *P. falciparum* parasite strain we used, W2mef, invades RBCs in a sialic-acid

dependent manner but W2mef parasites can switch to the sialic-acid independent invasion

pathway, if selected to invade RBCs depleted of sialylated surface proteins upon

neuraminidase treatment (21). This switch capacity is correlated with the expression of the

parasite ligand Rh4 (21). *rh4* is only expressed by a subset of the W2mef parasites (~6% of

the population) (22) and we wondered if we could identify these cells in our dataset. To do

that, we quantified the number of cells expressing genes encoding ligands either binding to

sialylated host cell receptors (*eba-175*, PF3D7_0731500; *eba-140*, PF3D7_1301600; *eba-*

181, PF3D7_0102500; and *rh1*, PF3D7_0402300) or to non-sialylated host cell receptors

(*rh2a*, PF3D7_1335300; *rh2b*, PF3D7_1335400; and *rh4*, PF3D7_0424200). Whereas 86%

of intracellular merozoites express at least one gene encoding for a sialic-acid-dependent

ligand, we could not detect *rh2b* expression, and only 8,5% of the population expresses *rh2a*

or *rh4* implicated in the sialic-acid-independent invasion pathway (Fig 4A). As expected, *rh4*

is only expressed by 6,5% of intracellular merozoites.

We also wanted to identify, in the merozoite fraction, the intracellular merozoites that

are about to egress from the infected host cell. They are expected to have a similar gene

repertoire to free merozoites, which we identified in the flow-through fraction, so to identify

these cells, we combined the data from the merozoite and two flow-through cells and filtered

all cells using the flow-through parameters (Fig 4B). There are 191 merozoite cells in the

integrated dataset (S1 table). These cells are here called late stage merozoites. We identified

the genes that were over-expressed in the late stage merozoites versus the flow-through cells (Fig 4C, S5 Table), in order to establish a set of genes to be used as signature, and found 133 genes, coding for proteins implicated in host cell invasion, motility, host cell interaction and exit (Fig 4D, S5 Table). All of the over-expressed genes encode proteins identified in the merozoite proteome (S5 Table). Moreover, many of the late stage merozoites signature genes reach peak transcription and stability at 1 or 48 hpi, according to (19), as the merozoites are preparing to egress/invade (S4AFig; S5 Table). This tendency is also seen for the marker genes of free merozoites (S4AFig; S2 Table) and about half of the free merozoites marker genes are signature genes of the late stage merozoites (S4B Fig). As a final confirmation of these cells identity as late merozoites cells, we find that they tend to have a later pseudotime than other intracellular merozoites (Fig 4E), as determined by the merozoite trajectory analysis (Fig 3C; S1 Table).

Identification of sexual and sexually committed merozoites

Sexually committed merozoites, which will later give raise to male and female gametocytes have never been identified. Because *P. falciparum parasites* must invade red blood cells before sexually committing (3), some of the free merozoite cells we identified should be sexually committed. To determine which free merozoites are sexual or sexual, we integrated the two flow-through datasets and applied Seurat to it (Fig 5A, S5A Fig, S6 Table). Within the integrated dataset, cells over-expressing the free merozoite marker genes are found within clusters 4 and 13 (Fig 5B, S5B Fig, S6 Table). These cells also contain less RNA and encode less transcripts than other cells (S5C Fig), express the merozoite marker *msp1* (S5D Fig) and encode invasion-related genes (Fig 5C, S6 Table), which are all hallmarks of extracellular merozoites. On the other hand, the other cells of the integrated dataset express the *rex2* ring marker gene and do not express free merozoite marker genes and are therefore rings (S5E Fig). There are few marker genes in common between the clusters 4 and 13 and all of these are signature genes of free merozoites (Fig 5E, S6 Table), indicating that the cells

in the two clusters are distinct. Because the cluster 5 cells encode sexual genes (Fig 5C, S6

Table) and several of the cluster 12 marker genes encode proteins that have previously been

implicated in gametocytogenesis (S6 Table), namely, the ApiAP2 proteins AP2-P, AP2-G5

and AP2-Z (12,23,24), we conclude that the free merozoites in cluster 13 are sexually-

committed cells (Fig 5F). On the other hand, the free merozoites in cluster 4 are asexual (Fig

5F). As expected, there are more asexual free merozoites than sexual free merozoites (S1

Table). The branching out of cells into sexual commitment is supported by the trajectory

analysis (S5F Fig). The cluster 5 cells over-express bona fide sexual markers (of the 35

marker genes, 25 were previously identified as sexual genes (12,25) (S6 Table)) and are thus

here called sexual cells (Fig 5F). The cluster 13 cells are herein named committed cells (Fig

5F).

267   We then searched for sexual and sexually committed intracellular merozoites in the

integrated dataset of the merozoite and flow-through cells used before to identify the late stage

merozoites. To do that, we applied Seurat to the integrated dataset (S5G Fig, S1 Table). We

identified cells expressing commitment genes in cluster 10 and cells expressing sexual marker

genes in cluster 7 (Fig 5G, S5 Table). 24 of the 69 committed cells and 7 of the 134 sexual

cells are merozoites (Fig 5G, S1 Table). 6 genes are differentially expressed by sexually

committed merozoites and flow-through cells (S5H Fig, S5 Table), suggesting that committed

merozoites have a distinct gene expression signature. There are no differentially expressed

genes between sexual merozoites and sexual flow-through cells, likely due to the reduced

number of sexual merozoites identified (S5 Table). Few of the marker genes of committed

cells were previously reported as signature genes of sexually committed parasites or early

gametocytes (25,26) (Fig 5H), and *ap2-g* is not expressed in these cells (Fig 5I), indicating

that we identified here an earlier state of sexual commitment characterized by the expression

of cell cycle and chromatin-related genes (Fig 5J, S5 Table).

282   **Regulation of gene expression during merozoite development**

There is a good correlation between the time of peak transcription and of peak stability

for most merozoite genes (S3G Fig; S2 Table), as determined by (19), suggesting that gene

expression during merozoite development is regulated by the binding of transcription factors

to specific DNA motifs in the promoter sequences. The ApiAP2 DNA-binding proteins are the

main family of transcription factors in the parasite (27) so we searched for ApiAP2 proteins

implicated in regulation of merozoite genes expression. The ApiAP2 proteins AP2-I, AP2-LT,

AP2-P and AP2-EXP and the bromodomain protein BDP1 have been linked to expression of

invasion genes (20,24,28–30). To determine if these proteins regulate any of the merozoite

gene clusters related to invasion (clusters 5, 6 and 7), we quantified the percentage of AP2-I,

AP2-LT, AP2-P, AP2-EXP and BDP1 target genes, as previously determined by ChIP-Seq

(20,24,28–31), in each of the invasion clusters. 82% of the promoters of the cluster 7 marker

genes are bound by AP2-I, BDP1 or a combination of the two proteins (S5A Fig) and several

of these regions are also bound by AP2-LT, AP2-EXP and AP2-P (Fig 5A; S2 Table). On the

other hand, few of the cluster 5 or 6 gene promoters are bound by these proteins (Fig 5A, S2

Table). The fact that the cluster 7 marker genes may be regulated differently from the cluster

5 and 6 marker genes is supported by the fact that there are differences regarding the time of

peak transcription and peak stability of the different invasion cluster marker genes, as

established by Painter *et al*. (19). Over 60% of the cluster 7 marker genes are peak transcribed

or stabilized between 36 and 48 hpi, i.e., during merozoite development (S5B-C Figs; S2

Table). On the other hand, transcription and stability of the clusters 5 and 6 marker genes

peaks instead at 1hpi or 48hpi (S5B-C Figs; S2 Table), so at the transition between merozoite

egress and host cell invasion.

Analysis of published ChIP-Seq data did not identify any other proteins associated with

regulation of expression of the merozoite genes so we searched for enrichment of DNA

sequence motifs in the promoters of the genes. We identified one DNA motif, enriched in the

promoters of the marker genes of clusters 3, 5, 6 and 9, with an AC core, that we named

merozoite DNA motif 1 (Fig 5B, S7 Table). A *cis*-regulatory element very similar to merozoite

DNA motif 1 was previously identified *in silico* (32), indicating that merozoite DNA motif 1 is

frequently found in gene promoters. Comparison of merozoite DNA motif 1 with the database

of DNA motifs bound by purified GST-tagged AP2 domains *in vitro* (27), identified AP2-G5

(S5D Fig, S7 Table). However, there is no correlation between the presence of merozoite DNA

motif 1 and the binding of AP2-G5. 35% of the promoters of clusters 4 and 5 are bound by

AP2-G5, as determined by ChIP-Seq (33) (S5E Fig, S2 Table), but we only identified

merozoite DNA motif 1 upstream of the genes of cluster 5 (Fig 5B). Upstream of the marker

genes of the other clusters, we identified AT-rich DNA motifs, reflecting the composition of the

genome of the parasite (S5F Fig).

We also determined which *apiap2* genes are expressed by merozoites (Fig 5C, S2

Table). AP2-P and AP2-LT, binding upstream of the marker genes of cluster 7, are expressed

in merozoites. We also detect expression of AP2-O and AP2-L. The first has been linked to

expression of the variant *var* genes in *P. falciparum* (34). SIP2 and AP2-Tel, which in *P.*

falciparum bind to telomere ends (35,36), are also expressed in merozoite cells. Free

merozoites (cluster 0) express almost all *apiap2* genes expressed by intracellular parasites,

as well as 10 other genes that we did not detect in intracellular merozoites (Fig 5C, S2 Table).

Discussion

Here we used single cell RNA-sequencing to identify the gene expression profile of the

RBC invasive stages of the malaria parasite, the merozoites. The merozoites were collected

using magnetic purification and a specific filter (10). We validated this approach by showing

that merozoites can be extracted from within schizonts as early as 32 hpi, that merozoite cells

express the merozoite marker *msp1*, and that several of the merozoite genes identified here

encode previously identified merozoite proteins (14). This is only the second time that

merozoites are shown to be transcriptionally active. The first study to show this was Reers *et*

al. (8). 93 or 95% of the genes we define here as expressed by late stage merozoites or

extracellular merozoites, respectively, were identified in that study as being over-expressed in

merozoites. On the other hand, only 61% of the genes expressed by all intracellular

merozoites were previously defined as being over-expressed in merozoites (S6G Fig). This

indicates that the early merozoite genes remained understudied and that our work revealed

the gene repertoire of both early and late stage intracellular merozoites. This is also supported

by the results of the single cell RT-qPCR assays and the fact that all the marker genes of late

stage merozoite genes encode proteins identified as part of the merozoite proteome (14),

whereas only 59% of the intracellular merozoite marker genes do (S2 and S3 Tables).

We show that many of the merozoite invasion cluster 7 genes are bound by AP2-I,

BDP1, AP2-LT and AP2-P, suggesting that expression of these genes is regulated by those

proteins. We identified in the promoter region of some of the merozoite marker genes, a DNA

motif here called merozoite DNA motif 1. It remains unknown what protein binds to merozoite

DNA motif 1 and if this motif is important for expression of the genes. Further studies aimed

at identifying the regulatory mechanisms implicated in expression of the merozoite genes

should clarify this.

Tripathi *et al.* showed variation in gene expression between merozoites in schizonts of

the same age (37). By comparing our data to theirs we find that, on average, merozoite genes,

expressed by both intracellular and extracellular merozoites, have a variability index score of

1, suggesting that their expression is stochastic (S6H Fig, S2 Table). This may explain the

diversity of chromatin opening patterns we found, even for genes expressed by the cells of

the same cluster, with the exception of the marker genes of invasion cluster 7 (S2 Table),

when we compared our dataset to a published ATAC-Seq study (38). Cells in which the

chromatin is accessible activate gene expression while cells with closed chromatin do not.

That is the case of the malaria clonally variant gene *eba-141*, over-expressed by the cluster 5

cells, for which increased promoter accessibility leads to increased gene expression (39).

Random fluctuation of gene expression in individual cells is a remarkable source of variability

(40) and establishes cell identity (41). In the case of malaria, stochasticity of gene expression

provides flexibility to the parasite population and ensures productive invasion (42). As

calculated here, 6% of the merozoite population of the W2mef parasites expresses the *rh4*

ligand, essential for the sialic-acid invasion dependent pathway, and that is why this strain is

able to switch invasion pathways. Other genes that are only expressed in a subset of

merozoites may dictate other behaviors.

When examining gene expression of sexually-committed cells, we uncovered a primal

state of parasite sexual commitment, preceding expression of *ap2-g* and other known

gametocyte markers. Future exploration of these cells will allow discovery of proteins

implicated in triggering of sexual commitment.

In summary, we identified here early and late stage intracellular merozoites, sialic-acid

dependent and sialic-independent cells, extracellular and intracellular merozoites, sexually-

committed and sexual cells, despite the fact that some of these cells are rare and represent

as few as 2% of all sequenced cells (Fig 6D). For each of these cells, we establish their gene

expression profile. Our work completes the single cell gene expression atlas of *P. falciparum*,

which did not yet contain information for the merozoite stage.

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).

For scRT-qPCR or to determine when merozoites could be released from schizonts, parasites

were double synchronized to the ring stage, 3 hours apart, for several cycles by incubating

pelleted cultures 1:1 with 0.3M L-Alanine, 10mM HEPES pH 7.5 solution for 10 min at 37°C

(43), after which cultures were centrifuged, resuspended in fresh media and placed back in

culture. Then, starting at 30 hours post-invasion, schizonts were passed through LD columns

(Miltenyi Biotec). The schizonts were eluted from the column with RPMI 1640 and then passed

through the 1.2µm filter (Pall) attached to a 10ml syringe to release the merozoites inside as

described in (10).

For scRNA-seq, a mixed culture of non-infected RBCs, schizonts, rings and free merozoites

were magnetically purified. The flow-through, corresponding to ring stage parasites, free

merozoites and non-infected red blood cells, was recovered. The elution corresponds to the

merozoite fraction. Parasites were counted with a Neubauer chamber and diluted with

1XPBS/0.04%BSA to 1 million cells/ml.

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

Images of blood smears were acquired with the widefield microscope Eclipse (Nikon) at 100x

amplification. To stain with DAPI, purified schizonts or merozoites were fixed in

1XPBS/4%formaldehyde, washed and deposited into glass slides mounted with VectaShield

Antifade medium containing DAPI (Vector laboratories) and imaged with a SP8 confocal

microscope (Leica) at 63x amplification. Images were treated with ImageJ.

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 (37) 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

(44) 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 (45) to organize the merozoite and

ring cells.

Motif enrichment analysis was done using STREME (46) to identify enriched motifs in the

promoter regions (downloaded from PlasmoDB) as compared to scrambled sequences of

similar length. TOMTOM (47) was used to compare the *de novo* discovered motifs to

previously *in silico* discovered motifs (27).

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

those identified in (38). Whenever more than one peak was assigned to a gene promoter, we

only considered the earlier time point. For most genes, there was only one peak of

accessibility.

The transcription and RNA stability peak time of the marker genes expressed in each cluster

was calculated in (19).

To determine the percentage of genes encoding proteins detected in mature merozoites by

mass spectrometry we compared our dataset to the high-throughput LC-MS/MS of *P.*

falciparum 3D7 merozoites data generated by Shahid Khan from Leiden University that

identified over 1000 proteins (14). We only considered proteins detected with at least 2

peptides.

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

target genes identified in (20,24,28–31,33). Whenever ChIP-Seq data was available from

multiple sources, we only considered target genes if found in two datasets.

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 them as belonging to that certain cluster.

Venn diagrams were generated using the online tool BioVenn (48).

Gene Ontology (GO) enrichment analysis was done using the GO feature at PlasmoDB (49).

Orthologue searches were done using OrthoMCL (50).

Graphs and statistics were done using GraphPad Prism version 10.0.0 for Mac, GraphPad

Software, Boston, Massachusetts USA, www.graphpad.com.

Single cell RT-qPCR

The assay was done as described in (51) with few modifications. Briefly, single parasites

diluted in water were deposited into 96-well PCR plates containing saponin, water and dNTPs.

RT buffer, Ribolock, Maxima RT (Thermo Fischer Scientific) and random hexamers were

added to a final volume of 15μl and the plate was incubated at 25°C. The RT reaction was

split into 3 qPCR plates and subjected to qPCR using Sso fast Eva Green (BioRad). The

primer sequences as well as the qPCR results are available in S4 Table.

Data availability

All RNA sequencing data generated in this study has been deposited in NCBI's Gene

Expression Omnibus and is accessible through GEO series accession number GSE279639.

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Authors contribution

Conceptualization: JMS

Parasite culturing: LP, JMS, LM

Single cell experiment: YJ

Data analysis: DN, CH, JMS

Writing: JMS, CH

Competing interests

The authors declare no competing interests

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Figure 1

A

B

Figure 2

Figure 3

Figure 4

A

Sialic-Acid Dependent
- EBA-175
- EBA-181
- EBA-140
- Rh1

Sialic-Acid Independent
- Rh2a
- Rh4

UMAP2
UMAP1

B

- merozoites
- flow-through 1
- flow-through 2

C

-Log10 p-value

- over-expressed in late merozoites
- under-expressed in late merozoites

msp9
rhoph3
rap1
sera5
GAMER
eba-175
eba-140
rh4

Log2 Fold Change

D

GO-term late merozoite genes

Enrichment (-log10 p-value)

- Movement in host environment
- Entry into host
- Biological process involved in interspecies interaction between organisms
- Exit from host cell

E

Cells

Other intracellular merozoites

Late merozoites

Pseudotime

Figure 5

Figure 6

A

% genes

Invasion cluster 5
Invasion cluster 6
Invasion cluster 7

AP2-I, BDP1, AP2-LT, AP2-EXP, AP2-P

B

Merozoite DNA motif 1: ASWACW

AGAACAAA
Cluster 3
Score: 3.4 E-6

GAACAAG
cluster 5
E-value: 2.4

AAGACTA
Cluster 6
E-value: 2

GTACTACGAA
Cluster 9
E-value: 6.9

C

PF3D7_1239200
PF3D7_0420300
PF3D7_1143100 (AP2-O)
PF3D7_0604100 (SIP2)
PF3D7_1107800 (AP2-P)
PF3D7_0802100 (AP2-LT)
PF3D7_0613800
PF3D7_0622900 (AP2-Tel)
PF3D7_0730300 (AP2-L)
PF3D7_0516800 (AP2-O2)
PF3D7_0934400
PF3D7_1007700 (AP2-I)
PF3D7_1115500
PF3D7_1222400
PF3D7_1449500 (AP2-O5)
PF3D7_1466400 (AP2-EXP)
PF3D7_0611200 (AP2-EXP2)
PF3D7_1305900 (AP2-O4)

Clusters
1 2 3 4 5 6 7 8 9 10 0

Log2Fold Change

D

Merozoite fraction

Late stage merozoites
Sialic-acid independent
Sialic-acid dependent
Sexual

Flow-through fraction

Extracellular merozoites
Sexual

Figure S1

Figure S2

Figure S3

Figure S4

A

B

Figure S5

Figure S6

Fig 1 – **Single cell RNA-sequencing of merozoites.**

(**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 and later on trophozoites. 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**) Schizonts were magnetically purified from either a parasite culture containing 10% infected RBCs, corresponding to 90% schizont-stage parasites, 9.9% ring-stage parasites and 0.1% free merozoites (top) or corresponding to 80% schizont-stage parasites, 19.9% ring-stage parasites and 0.1% free merozoites (bottom). The merozoites inside the schizonts collected from the first parasite culture were released by filter passage and processed for single cell RNA-seq (merozoite fraction). In the flow-through of the magnetic purification of the two parasite cultures, we collected the non-infected RBCs, the ring-stage parasites and the free merozoites. The flow-through fractions from the two parasite cultures were processed independently for single cell RNA-seq (flow-through fractions 1 and 2).

Fig 2 – Identification of free merozoites.

(**A**) Percentage of merozoites and flow-through cells expressing only *msp1*, only *rap2* or the two genes, showing that the merozoite cells express the merozoite marker *msp1* but not the ring marker *rap2*. (**B**) Bar graph showing how many genes expressed by the cells of the merozoite fraction encode proteins identified in the Khan merozoite proteome (black) or are overexpressed or downexpressed in merozoites versus schizonts (pink and light purple, respectively) or are overexpressed or downexpressed in merozoites versus rings cells (green and dark purple, respectively), according to Reers *et al.*. (**C**) UMAP representation of the flow-through cells colored according to the SEURAT cluster. (**D**) GO-term analysis of the marker genes of each flow-through cluster. Because there is no GO-term associated with gametocytes, word search analysis was done instead for cluster 2 genes. The full list of GO-terms and words is in the S2 Table (cluster 0) and S3 Table (other clusters).

Fig 3 – Gene expression of the intracellular merozoites.

(**A**) UMAP representation showing the merozoite cells grouped by SEURAT cluster (the number of cells in each cluster is in S1 Table). Cells are colored according to the corresponding cluster. A heatmap showing expression of 100 randomly selected genes in the 10 clusters is in S3A Fig. The distribution of the number of genes/UMIs per cell in each cluster is in S3B Fig. (**B**) GO-term analysis of the genes differentially expressed in each merozoite cluster shows that each cluster expresses genes encoding proteins implicated in different processes. Bar graphs are colored according to the corresponding cluster. Only the most significant GO-terms are shown. For the complete GO-term analysis, check S2 Table. (**C**) Merozoite clusters pseudotime as determined by Monocle. Boxes are colored according to the corresponding cluster. The pseudotime of each merozoite cell is S1 Table. (**D**) Heatmap showing expression of selected marker genes of each merozoite cluster. Underlined are transcripts for which we designed qPCR primers. (**E**) Results of the single cell RT-qPCR on single merozoites collected at 32hpi, 42hpi and 47hpi, showing the percentage of merozoites expressing none of the marker genes, only one of the genes or overexpressing one of the marker genes versus the other. Cells overexpressing one or another marker gene are detected at different time points, suggesting that we collected merozoites of different ages in the merozoite fraction of the magnetic purification. The raw data of the RT-qPCR assays is in S4 Table.

Fig 4 – **Identification of sialic-acid independent and late stage merozoites.**

(**A**) UMAP representations of the merozoite cells colored according to expression of genes encoding for parasite ligands of the sialic-acid dependent invasion pathway (top) (EBA-175, purple; EBA-140, blue; EBA-181, brown; and Rh1, red) or of the sialic-acid independent invasion pathway (bottom) (Rh2a, green; and Rh4, orange) showing that few cells express sialic-acid independent ligands. (**B**) UMAP representation of the combined dataset of late stage merozoites and flow-through cells. Cells are colored according to the fraction they originated from (merozoite or flow-through). (**C**) Volcano plot showing the genes over-expressed (red) or under-expressed (blue) in late stage merozoite cells versus ring cells. The name of the encoding proteins for some of the overexpressed genes is shown (the full list of genes is in S5 Table). (**D**) GO-term analysis of the genes overexpressed in late stage merozoites. The full list of genes overexpressed in late stage merozoites and the GO-term analysis are in S5 Table. (**E**) Late merozoite cells (red) tend to have a later pseudotime than other intracellular merozoites (gray) (the pseudotime of each cell is in S1 Table). This was determined by identifying in the merozoite fraction, the barcodes assigned as late merozoites in the combined dataset of late stage merozoites and flow-through cells. The pseudotime was attributed by Monocle when it calculated a trajectory for the cells of the merozoite clusters.

Fig 5 – Identification of sexual merozoites.

(**A**) Seurat clusters of the integrated flow-through dataset (the full list of genes expressed in each cluster is in S6 Table and the number of cells on each cluster is in S1 Table). (**B**) There are two subsets of free merozoites, one in cluster 4 and one in cluster 13, as determined by over-expression of the top 10 free merozoite markers. (**C**) GO-term analysis of the marker genes of clusters 4 and 13 show that these cells expressed invasion-related genes, while cluster 5 cells express gametocyte-related genes (the full GO-term analysis are in S6 Table). Bars are colored according to the cluster. (**D**) There are only 16 common marker genes between the clusters 4 and 13 and all of these are markers of free merozoites (the identity of these genes is in S6 Table). (**E**) UMAP showing which cells express the top 10 free merozoite markers (free merozoites, in pink), *ap2-g* (sexual cells, in red) or *rex2* (rings, in green). One subset of free merozoites is asexual while the other one is sexually-committed. The sexual commitment pathway is shown. (**G**) Cluster 7 cells of the integrated merozoite and flow-throughs dataset are sexually-committed cells (blue) whereas cluster 10 cells are sexual cells (green), as determined by differentially gene expression analysis (S5 Table). Which cells are merozoites or flow-through is show in red or black/green, respectively. (**H**) Graph showing that more signature genes of sexual cells (green) were previously reported by Dogga *et al*. or Mohammed *et al*. as being over-expressed in committed cells or early gametocytes, as compared to the marker genes of committed cells (blue) (the list of genes is in S5 Table). (I) Sexually-committed cells do not express *ap2-g*. (**J**) GO-term analysis showing that committed cells express DNA replication, chromatin and cell-cycle genes (blue), while sexual cells (green) express gametocyte-related genes (the full GO-term analysis is in S5 Table).

Fig 6 – Regulation of expression of the merozoite genes.

(**A**) Graph showing the percentage of cluster 5 (pink), cluster 6 (light blue) or cluster 7 marker genes (dark blue) that are ChIP-Seq targets of AP2-I, BDP1, AP2-P, AP2-EXP or AP2-LT, as determined by Santos *et al*., Josling *et al*., Subudi *et al*., Russel *et al.*, Bonnell *et al*. and Shang *et al.,* respectively. The list of target genes for each cluster is in S2 Table. (**B**) STREME analysis identified an enriched DNA motif, here called merozoite DNA motif 1, in the promoter region of the marker genes of clusters 3, 5, 6 and 9. E-value and Scores indicate the significance of the found DNA motif. The DREME and TOMTOM analysis are in S6 Table. (**C**) Heatmap showing expression of *apiap2* genes in intracellular (cluster 1 to 10) and free merozoites (cluster 0). Black boxes indicate absence of expression. The expression data is in S2 Table. (**D**) Scheme of the type of merozoites identified in the merozoite and flow-through fractions.

Supplementary Information

S1 Fig – **Parasites purification**.

(**A**) Giemsa-stained blood smears of 32 hpi schizonts before (left) and after (right) magnetic purification. DAPI staining of the purified schizonts (S) is also shown (BF: brightfield). Higher magnification of a DAPI staining region is shown. (**B**) DAPI staining of 32 hpi merozoites after filter passage of the schizonts in A. (**C**) Giemsa-stained blood smear of the parasite cultures used for single cell RNA-sequencing showing the presence of rings (R), schizonts (S) and free merozoites (M). (**D**) Giemsa-stained blood smears of the purified merozoite fraction used for single cell RNA-sequencing showing the presence of merozoites (M). (**E**) Giemsa-stained blood smear of the flow-through fraction 1 used for single cell RNA-sequencing showing the presence of rings (R) and free merozoites (M). (**F**) Plots showing the number of genes and UMIs detected per merozoite cell. (**G**) Plots showing the number of genes and UMIs detected per flow-through 1 cell. (**H**) Plots showing the number of genes and UMIs detected per flow-through 2 cell. In (**F**), (**G**) and (**H**), each dot represents a cell.

S2 Fig – **Merozoite cells analysis**.

(**A**) Violin plot showing the expression level of *msp1* in merozoite and flow-through cells. (**B**) Violin plot showing the expression level of *rex2* in flow-through cells (the transcript was not detected in merozoites). (**C**) Heatmap showing differential expression of 100 randomly selected genes in the different clusters of the two flow-throughs. Each row represents a cluster. (**D**) Left: UMAP representation of the flow-through cells colored by number of genes detected per cell. Right: UMAP representation of the flow-through cells colored by number of UMIs (reads) detected per cell.

S3 Fig – **Merozoite clusters analysis**.

(**A**) Heatmap showing differential expression of 100 randomly selected genes in the different merozoite clusters. Each row represents a cluster. (**B**) Top: UMAP representation of merozoite cells colored by the number of genes detected per cell. Bottom: UMAP representation of merozoite cells colored by number of UMIs (reads) detected per cell. (**C**) Pseudotemporal analysis of the merozoite clusters showing that there is only one trajectory. The cells pseudotime is in S1 Table. (**D**) Percentage of genes annotated as putative or unknown in the different merozoite clusters. (**E**) Venn diagram showing no overlap between marker genes expressed in clusters 2 and 4 (GO-term dense granules), clusters 1 and 8 (GO-term nucleus) and 4 and 8 (GO-term vacuole) and very little between clusters 8 and 10 (GO-term RNA binding). There is little overlap between invasion clusters 6 and 7 or 5 and 7 but invasion clusters 5 and 6 are similar. Circles are colored according to the corresponding cluster and in brackets are the number of marker genes. (**F**) Differentially expressed (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. (**G**) Timing of peak transcription or peak stability for the marker genes of each merozoite cluster, as determined by Painter *et al*. The timing of peak transcription and stability for each gene is in S2 Table. (**H**) Percentage of marker genes of each merozoite cluster over-expressed in merozoites versus schizonts (black) or rings (pink) or under-expressed in merozoites versus schizonts (green) or rings (purple), as determined by Reers *et al*.. (**I**) Giemsa-stain of the schizont cultures used for scRT-qPCR (before magnetic purification and filter passage).

S4 Fig – **Comparison of late stage merozoites with free merozoites**.

(**A**) Percentage of genes expressed by free merozoites or late stage merozoites that are peak transcribed (black) or peak stabilized (pink) at 1 or 48 hpi as determined by Painter *et al.*. (**B**) Many of the genes overexpressed in late merozoite cells are marker genes of free merozoite cells.

S5 Fig – **Analysis of sexual merozoites**.

(**A**) UMAP representation of the Seurat clusters of the combined flow-through dataset showing the number of cells in each flow-through sample (the number of cells in each cluster is in S1 Table, the marker genes of each cluster is in S5 Table). (**B**) Graph showing higher expression of the top 10 free merozoites marker genes in clusters 4 and 13. (**C**) UMAP representation showing that some of the cells in clusters 4 and 13 contain less RNA (nCount) and encode less transcripts (nFeature). (**D**) Some of the cluster 4 and cluster 13 cells express *msp1*, indicating that they are free merozoites. (**E**) rex2 is less expressed in the cluster 4 and cluster 13 cells. Violin plots are colored according to the cluster. (**F**) UMAP representation of the trajectory of the cells in the combined flow-through dataset. (**G**) UMAP representation of the Seurat clusters of the combined merozoite and flow-through dataset (the number of cells in each cluster is in S1 Table, the marker genes of each cluster is in S5 Table). (**H**) Volcano plot showing in blue the genes overexpressed by the sexually-committed merozoite cells of cluster 10 (the full list of genes is in S5 Table).

S6 Fig – **Expression timing and stochasticity analysis of the merozoite genes.**

(**A**) The majority of marker genes expressed in merozoite invasion cluster 7 are ChIP-Seq targets of AP2-I (pink), BDP1 (blue) or both (orange), as determined by Santos *et al*. and Josling *et al*., respectively. (**B**) Timing of peak transcription or peak stability for the marker genes of each of the merozoite invasion clusters, as determined by Painter *et al*. The timing of peak transcription and stability for each gene is in S2 Table. (**C**) Percentage of marker genes of the invasion clusters 5, 6 or 7 or of free merozoites with peak transcription (black) or stability (pink) at 1 or 48 hpi, as determined by Painter *et al*., showing that only the marker genes of clusters 5 and 6 reach peak expression at this time points. (**D**) Merozoite DNA motif 1, found by STREME, resembles the AP2-G5 DNA-binding motif as determined by TOMTOM. The STREME and TOMTOM results are in S7 Table. (**E**) Genes with merozoite DNA motif 1 are not AP2-G5 ChIP-Seq targets, as determined by Shang *et al*.. The list of AP2-G5 target genes in each cluster is in S2 Table. (**F**) In the gene promoters of clusters 1, 2, 4, 8 and 10, we only identified AT-rich DNA motifs. (**G**) Graph showing the percentage of marker genes of early merozoites (black), late stage merozoites (pink) and free merozoites (green) previously found to be overexpressed in merozoites by Reers *et al*.. (**H**) Graph showing the average variability index score (VIS score), as calculated by Tripathi *et al*., for the marker genes expressed by the merozoite clusters or by free merozoites. The VIS score for each gene is on S2 Table.

S1 Table – Number of cells and reads obtained after single cell RNA-sequencing, number of cells in each Seurat cluster for the merozoites and flow-through samples, pseudotime of the merozoite cells.

S2 Table – Gene expression and GO-term analysis of the merozoite cells, including all clusters of the merozoite fraction (1-10) and the cluster 0 of the flow-through fractions (free merozoites).

S3 Table – Gene expression and GO-term analysis of the flow-through clusters (except cluster 0).

S4 Table – List of primers used for single cell RT-qPCR and raw data from the single cell RT-qPCR assays.

S5 Table – Gene expression and GO-term analysis of the genes over-expressed and down-expressed in late merozoites versus ring cells as well as of each SEURAT cluster. It includes the list of marker genes of committed and sexual cells.

S6 Table – Gene expression and GO-term analysis of the genes over-expressed and down-expressed in each cluster of the combined flow-through clusters. It includes the list of marker genes of committed and sexual cells.

S7 Table – STREME and TOMTOM results.