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**A systems biology approach to study the
dynamics of membrane microdomains in
malaria parasites.**

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PhD Thesis

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Authors: Marco Lalle, Serena Camerini, Serena Cecchetti, Renata Finelli, **Gabriella Sferra**, Joachim Müller, Giorgio Ricci, Edoardo Pozio

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PART I

Abstract

In recent years, several computational methods have been developed to predict protein-protein interactions at a genome-wide level. Among them, a Bayesian approach has been proposed to integrate “-omics” data from diverse sources, and reconstruct probabilistic global interactomes.

In order to apply this method to *Plasmodium falciparum*, the most virulent agent of the human malaria, we generated novel genomic data sets and gene expression profiles. In particular, we performed a re-assessment of the phylogenetic profile method proposing a new strategy to select reference genomes and adopting a novel measure of similarity. We also produced a new set of rosetta stone data on the basis of a large number of non-redundant genomes used as a reference set. Furthermore, diverse transcriptomic data have been organized to obtain gene expression profiles covering the entire intra-erythrocytic *Plasmodium* life-cycle. All data were then integrated to predict a global *P. falciparum* protein-protein interaction network. To gain insights on function and dynamics of specialized membrane compartments (lipid rafts), during *P. falciparum* development, we filtered our global interactome with stage-specific lipid raft proteomic data.

Functional and topological studies of the obtained stage-specific interactomes were undertaken. Our results revealed a conserved subnetwork, the lipid raft “functional core”, involved in fundamental parasite processes and dynamic clusters populated of stage-specific proteins, responsible for remodeling of lipid raft organization.

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1 – STATE OF THE ART

1.1 Prediction of protein-protein interaction networks.

Infectious diseases are the leading cause of human death, particularly in developing countries. Although in many cases drugs are available, the increasing emergence of pathogens resistant to drug treatments strongly requires to improve our understanding of the pathogen biology and in particular the key factors and processes that allow for disease establishment and progression. Biological processes occurring in a cell are driven by proteins that work in cooperation. For this reason, the understanding of a biological system requires a better knowledge of the interconnectivity between proteins in the different pathways and processes, which includes both physical and functional interactions.

In this perspective, reconstruction of protein-protein interaction (PPI) networks represents one of the challenges for both experimental and computational biologists. In the last years, several and diverse methods have been developed to infer PPIs. and different categories of predictors can be distinguished, as recently reviewed by Zahiri and colleagues (Zahiri et al., 2013).

Phylogenetic profiling is one of the most common methods to infer PPIs from genomic data, the basic idea being that functionally related proteins are encoded by coevolving genes and hence they may be captured by construction and comparison of their phylogenetic profiles. In the first implementation of the method, co-evolving proteins in a genome were identified by clustering binary

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phylogenetic profiles reporting the presence (1) or the absence (0) of protein homologs in genomes of a reference set (Pellegrini, et al, 1999). To do this a BLAST data base search was carried out for each protein of a given organism *versus* the entire reference set. Hits with a value higher than an established threshold were regarded as possible homologs and registered as 1 in the profile. An implementation of the method was proposed by Date and collaborators substituting the binary profiles with real values derived from the E-values of the BLAST matches and adopting the mutual information metric to measure the profile similarity (Date, et al, 2003). Among the measures of profile similarity successively proposed, the correlation-based measures have been shown to have the best predictive performances even if they capture only linear relationships (Date, et al., 2003; Enault, et al., 2003; Glazko, et al, 2004).

Another computational method based on genomic data to predict PPIs is the rosetta stone fusion protein method. The method relies on the observation that certain interacting proteins can be predicted, due to the presence in other organisms of orthologs fused in a single gene, encoding a multi-domain product named “rosetta stone protein” (Enright, et al, 1999). Protein interactions are then identified by comparing the protein sequences of the genome under examination with those of a reference set, to look for gene fusion events (Enright, et al, 1999). A score is assigned to each predicted interaction, based on the probability that the corresponding fusion event occurred by chance (Marcotte & Marcotte, 2002).

The usage of gene expression data to infer PPIs is based on the observation that proteins participating to the same complex or involved in the same biological

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pathway are often encoded by co-expressed genes (Jansen, et al, 2002). In the recent past, several technological platforms have been developed to measure the global gene expression in different cellular types. This led to the generation of a huge amount of expression data, available to the scientific community. Two methods are usually used to quantify simultaneously all transcripts of a biological sample: the microarray-based transcriptomics and, more recently, the direct RNA sequencing, also known as RNA-seq (Gibson, 2003; Nagalakshmi, et al, 2010). Co-expression of group of genes are established by means of classical statistical tools applied to time-course experiments.

However, PPIs predicted by different methods are not directly comparable because of the difference in their genome coverage and accuracy (Ito, et al, 2001; Deane, et al, 2002; Von Mering, et al, 2002). For these reasons, the integration of multiple datasets from different experimental technologies and platforms and from different computational methods becomes crucial to produce a comprehensive and accurate set of relationships between interacting proteins (Jansen, et al, 2003; Lee, et al, 2004).

Exploiting the Bayesian approach proposed by Jansen and colleagues (Jansen, et al, 2003) genomic and transcriptomic data sets, available for *Saccharomyces cerevisiae*, were used to derive a probabilistic PPI network. Each data set (phylogenetic profiles, gene-expression profiling, rosetta stone data) was compared with gold standard data sets, representing the benchmark, to derive a probability score. Under the assumption of independence of data sets, a global score was then obtained multiplying the single ones. It has been demonstrated that the performance of the integrated predictions strongly overcomes the one obtained from single approaches.

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In this work, we applied the Bayesian method to derive a novel PPI network for the malaria parasite *Plasmodium falciparum* using phylogenetic profiles, rosetta stone and gene expression data. Taking advantage of the increasing number of sequenced genomes, a novel set of phylogenetic profiles and rosetta stone data were derived. In particular we proposed a new measure to score profile similarity based on a recently proposed metric of correlation between variables (Szekely, et al, 2007), the distance correlation.

1.2 Malaria, a global public health threat.

Malaria is one of the major global public health threat together with AIDS and tuberculosis. About 3.2 billion people worldwide are estimated to live in countries and territories, mainly corresponding to the tropics and subtropics regions, at risk of malaria transmission and disease. Morbidity and mortality deeply impact on these populations causing hundred millions of clinical cases and half million deaths yearly. The highest burden is focused in Sub-Saharan Africa: around 90% of all deaths occurs in this region and the greatest part of them affects children under the age of five (WHO, World Malaria Report 2014). Malaria transmission is strongly influenced by climatic features as temperature, humidity and rainfall (Gubler, et al, 2001), and in the last decades, the climate changes are modifying malaria spreading, making this parasitosis stable in regions at the margin of its previous distribution (Chaves, et al, 2010). Furthermore, socio-economic trends (i.e., migration and tourism) strengthen imported malaria cases increasing the risk of parasite transmission in temperate areas where the vectorial capacity is high, as in the Mediterranean area

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(Odolini, et al, 2012). Moreover, the absence of an efficient vaccine and the growing number of resistance to drugs make necessary to improve our knowledge of the biology of the malaria parasites.

Malaria is caused by *Plasmodium*, a Protozoan belonging to the phylum of the Apicomplexa. *Plasmodium* life cycle takes place into two different hosts: a female mosquito of the genus *Anopheles* and a vertebrate host. Until recently, four species of the malaria parasite (*Plasmodium falciparum*, *Plasmodium vivax*, *Plasmodium ovale* and *Plasmodium malariae*) were considered able to infect humans and between them *P. falciparum* is the most virulent agent of human malaria.

Parasite life cycle (figure 1) starts when an infected female mosquito of the genus *Anopheles* bites a vertebrate host. The sporozoites reach the liver where the first asexual replication takes place within the hepatocytes. In 9-16 days, each sporozoite that enters the host hepatocytes gives rise to thousands merozoites, the erythrocyte invasive form. Inside the erythrocyte, merozoites rapidly become larger, ring-shaped young trophozoites.

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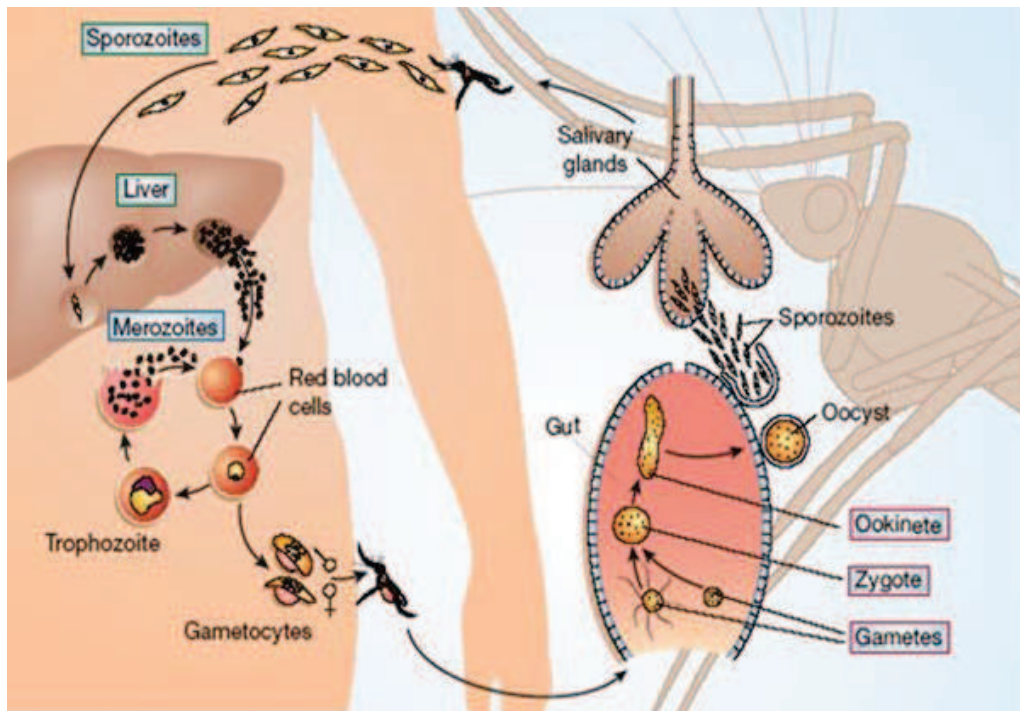


Figure 1. *Plasmodium falciparum* life cycle (from www.malwest.gr).

A rapid and repeated division of the trophozoite's nucleus forms a schizont, characterized by several nuclei immersed in the same cytoplasm. Following cytokinesis, 16-32 merozoites are formed per each erythrocyte. A pushing force coming from the inside-out turning of the erythrocyte membrane permits the egress of the merozoites from the infected red blood cell through a single osmotic-induced pore (Abkarian, et al, 2011). Red blood cell content is released together with the merozoites and is responsible of a large part of malaria symptoms. Released merozoites are ready to invade new erythrocytes. A small subpopulation of schizonts, committed to sexual differentiation (gametocytogenesis) differentiate into male and female gametocytes (Inselburg, 1983), the only forms infectious to mosquito (Smalley & Sinden, 1977).

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1.3 Parasite research in the “-omic” era.

The complex biology of the parasite, the difficulties of retrieving the pure stages, its low transfection efficiency and its haploid state that limits classic genetic approaches or determines an excessive time cost (Balu, 2012) encourage the use of high-throughput approaches to characterize protein function at local and genome-wide level.

In 2002, the first *P. falciparum* genome was completely sequenced (Gardner, et al, 2002) opening a novel era for the understanding of the parasite biology. The availability of the complete genome sequence encouraged the application of high-throughput methods to the study of *Plasmodium* developmental stages. Along with the genome sequencing, the first proteomic analysis of different stages of parasite life cycle (Florens et al., 2002; Lasonder et al., 2002) was also provided. Several transcriptome analyses came soon and revealed the highly ordered gene expression cascade characteristic of *P. falciparum* (Le Roch, et al, 2003; Bozdech, et al, 2003). These data, along with the observation that only few genes encode for factors transcriptionally regulated, supported the hypothesis of a strong post-transcriptional control in *Plasmodium* gene expression (Llinas, 2006). More recently, massive parallel RNA-sequencing approaches (Bentley, et al, 2008) further improve the status of the genome annotation (Su, et al, 1999) and the transcriptional profiling of the erythrocytic asexual stages of the parasite (Otto, et al, 2010).

In 2005 a large-scale analysis of about 3000 protein interactions has been performed by yeast-two-hybrid in *P. falciparum* (LaCount, et al, 2005)

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allowing the reconstruction of the first PPI network. After that, other PPI networks have been proposed as reviewed in (Ramaprasad, et al, 2012). However, these PPI networks provide information only on a limited set of *P. falciparum* proteins. In 2006 a novel method based on the integration of “-omics” data from diverse source was adopted to derive a global PPI network (Date, et al, 2006; Hu, et al, 2010)

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2 – AIM OF THE PROJECT

Antimalarial drug discovery and vaccine design have largely focused on compounds against blood stages of the parasite (Guiguemde, et al, 2012). The centrality of the blood stages has meant that extensive research efforts persist on specific biological processes commonly characterized by a manifold complex of membranes, such as erythrocyte invasion (Cowman & Crabb, 2006)

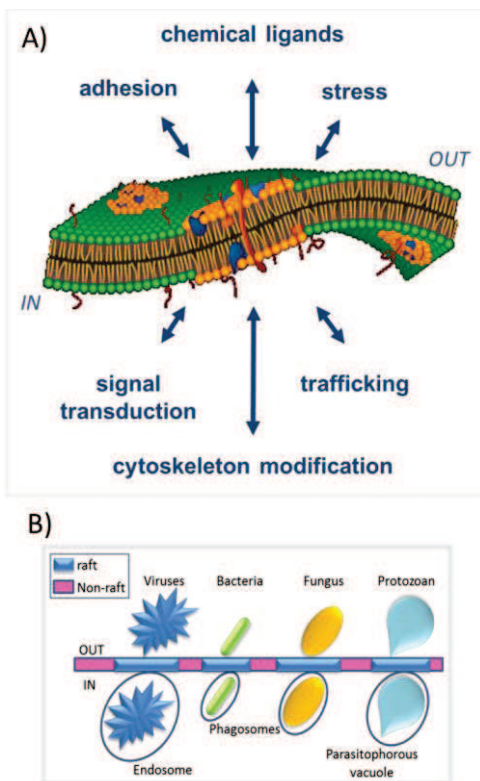


Figure 2. Lipid rafts structure and functions. A) Lipid rafts (in orange) distinct from the bulk membrane (green) are cholesterol-rich membrane microdomains that organize outside-in and inside-out responses to a wide range of stimuli; B) several pathogens target lipid rafts to enter the host cell.

and egress (Blackman, 2008). Furthermore, it has been shown that cell membranes are complex and inhomogeneous structures that perform and coordinate cell function by segregating or aggregating lipids and proteins. Despite of the complexity and relevance of the membrane system by which *Plasmodium* interacts with, enters and resides into the host cell, this area is relatively overlooked (Zuccala, et al, 2011).

Lipid rafts are cholesterol and sphingolipid-rich membrane compartments implicated in various cell processes by forming platforms that promote dynamic lipid-lipid, lipid-

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protein, PPIs (Allen, et al, 2007; Lingwood & Simons, 2010) (panel A of figure 2).

In *Plasmodium*, as it occurs in a large set of other pathogens (panel B of figure 2), these membrane microdomains play a crucial role in host-cell invasion and other key processes like trafficking and signaling (Vieira, et al, 2010; Murphy, et al, 2006; Koshino, et al, 2009; Di Girolamo, et al, 2008). For these reasons, “raftophilic” proteins that preferentially and temporarily partition into the lipid raft may represent suitable potential drug targets (Rajendran, et al, 2010).

In this work, we propose a systems biology approach to study the dynamics of the highly specialized membrane microdomain also referred to as lipid rafts in *P. falciparum*.

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3 – EXPERIMENTAL DESIGN

The peculiar richness of lipid rafts in cholesterol and sphingolipids is exploited to separate these microdomains from the rest of the membranes by sucrose density gradient. In the host laboratory, this method was applied to purify lipid rafts from *P. falciparum* young trophozoites, early schizonts, late schizonts, and

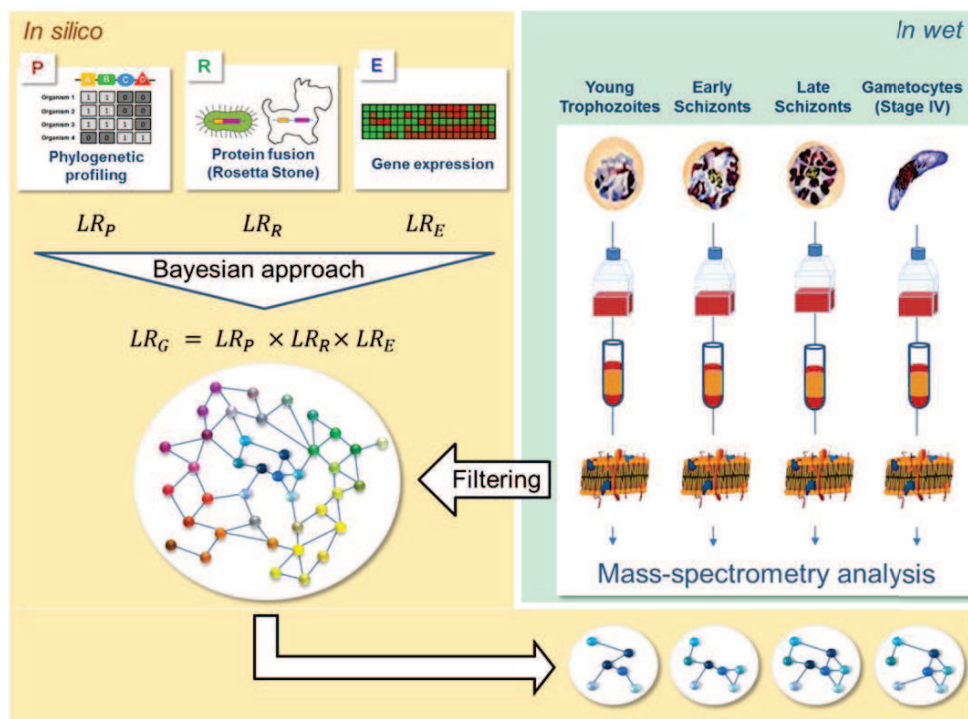


Figure 3. Experimental design. *In silico* approaches (evidences in light orange) are applied to predict PPIs from different data sources. A probability value representing the likelihood that an interaction occurs, is calculated from each dataset (LR_P from phylogenetic profiles, LR_R from rosetta stone data and LR_E from gene expression data). Then, a Bayesian approach is applied multiplying the probability values coming from each single dataset and calculating the probability that an interaction is likely occurring in the global interactome (LR_G). The *in wet* approach (evidenced in light green) was applied to purify the lipid rafts from different stages of *P. falciparum* erythrocytic life cycle and to analyze them by mass spectrometry. In the “filtering” procedure, the proteins identified as populating the lipid rafts at each stage are used to derive the corresponding stage-specific network.

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mature gametocyte. Corresponding stage-specific proteomes, obtained by mass spectrometry, were available in public database (right side of figure 3).

My PhD thesis focused on a comprehensive analysis of PPIs taking place in lipid rafts of asexual and sexual *P. falciparum* blood stages. To do this, we derived stage-specific interactomes and studied their architecture, functional organization and dynamics.

We took advantage of the great amount of available “-omics” data to construct phylogenetic profiles, adopting a novel method to measure their similarity, to derive a novel set of “rosetta stone proteins” and a gene expression profiling of both asexual and sexual stages (left side of figure 3). We then predicted a global PPI network of *P. falciparum* applying the Bayesian approach proposed by Jansen (Jansen, et al, 2003).

Stage-specific proteomes were then used to filter the global PPI network and thus to derive the corresponding stage-specific interactomes of lipid rafts.

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4 - RESULTS

4.1 Phylogenetic profile: the reassessment of the method.

The increasing number of genomic data makes phylogenetic profiling one of the most promising computational methods to predict PPIs. As mentioned in the Introduction, this method is based on the alignments between proteins from the genome under examination and proteins from selected genomes in a reference set, and on the comparison between phylogenetic profiles to detect possible co-evolving and thus interacting proteins. The two crucial points of this approach concern the selection criteria to include genomes in the reference set and the choice of the metric to measure the profile similarity.

Phylogenetic profiles of *P. falciparum* were constructed by Date and collaborators (Date, et al, 2006) using a reference set based on a limited number of genomes available at that time. Furthermore, to score the profile similarity they used the mutual information, whose limits in predicting positive correlations between arrays of real values have been recently recognized (Zhang, et al, 2015).

To overcome these limitations, in this work we proposed a novel procedure to construct phylogenetic profiles. We performed a re-assessment of the method by focusing first, on the strategy for the selection of genomes to be included in the reference set and then, on the measure used to score the profile similarity.

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The number of genomes in a reference set should be sufficiently high to ensure a robust statistics, however, to avoid any kind of bias not redundant genomes should be included. A good balance between these two requirements would guarantee a robust statistics and hence a good predictive performances of the method. To do this, we developed a strategy of genome selection, based on the evolutionary relationships between species and the quality of the genome sequences. We started considering the 1133 organisms collected in the eggNOG database (http://eggnog.embl.de/version_3.0/; version 3.0) that are manually selected following several criteria, like genome coverage, status of gene annotation and gene completeness (Ciccarelli, et al, 2006; Powell, et al, 2012). According to these criteria, genomes in the EggNOG database are classified in two categories: core and peripheral. The “core” set includes only “high quality” genomes, whereas the “peripheral” set includes genomes sequenced more recently, that are not still completely validated. On the basis of this classification and on the inspection of the evolutionary relationships in the Tree of Life, constructed using genomes in eggNOG, we derived four genome reference sets of different size and genome composition (Table I).

The first reference set (RS1) was derived by excluding from the 1133 organisms all “peripheral” genomes of strains of the same species. A second reference set (RS2) was obtained excluding the eukaryotic genomes with a “peripheral” attribute from RS1. To construct the third reference set (RS3), we progressively excluded “peripheral” prokaryotic genomes till halving the size of RS1. The last reference set (RS4) was obtained from RS3 by visual inspection of the Tree of Life, excluding close phylogenetically related eukaryotic genomes to reduce possible redundancy.

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Table I: characteristics of the reference sets.

	<i>Total</i>	<i>Prokaryotes</i>	<i>Eukaryotes</i>	<i>Archea</i>	<i>Ratio</i>
Reference set 1 (RS1)	774	594	120	61	5:1:0.5
Reference set 2 (RS2)	699	594	45	61	13:1:1.5
Reference set 3 (RS3)	336	230	45	61	5:1:1.5
Reference set 4 (RS4)	309	230	18	61	13:1:3.5

In order to assess the influence of both size and genome composition of the four reference sets on the predictive performance of the method, we constructed four phylogenetic profile data sets for *Saccharomyces cerevisiae* e *Escherichia coli* reference genomes using each of the four reference sets .

To align the *S. cerevisiae* and *E. coli* protein sequences against the proteins of the reference sets we used the Smith-Watermann alignment algorithm (Smith T.F. & Watermann M.S., 1981), and, as proposed by Date et al. (Date, et al, 2003), we constructed phylogenetic profiles as arrays of probability values obtained by the E-values, according to:

$$P = -1/\log_{10}(E) \quad [1]$$

For E-values lower than 10^{-1} , the probability value is set to 0.

To compare phylogenetic profiles and hence to predict potential PPIs, we used a novel correlation metrics, the distance correlation (dCor). DCor was proposed by Szekely in 2007 as an extension of the Pearson's correlation, but at

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difference with the linear coefficient, it measures any dependence between two variables X and Y. DCor satisfies the properties:

- a) $0 \leq \text{dCor}(X,Y) \leq 1$
- b) $\text{dCor}(X,Y) = 0$; if and only if X and Y are independent
- c) $\text{dCor}(X,Y) = 1$; if $Y = \alpha + \beta(X)$ where α and β are scalar
- d) $\text{dCor}(X,Y) \neq 0$; if $Y \approx f(X)$

To perform a comparison between dCor and Mutual Information (MI), usually used to measure phylogenetic profile similarity, we carried out an assessment of the method utilizing both dCor and MI.

The mutual information between profiles X and Y was calculated as:

$$MI(X,Y) = H(X) + H(Y) - H(X,Y) \quad [2]$$

where $H(X) = -\sum p(x) \ln p(x)$ is the summation of the marginal entropies, calculated over the intervals of probability distribution $p(x)$, and $H(X,Y) = -\sum \sum p(x,y) \ln p(x,y)$ represents the summation of the relative entropies of the joint probability distribution $p(x,y)$. Phylogenetic profiles are continuous variables and to apply MI they have to be discretized by binning the real values into intervals, and then deriving the marginal and the joint probabilities. MI was calculated by using the *mutualInfo* function (Joe, 1989) available in *bioDist* package (Ding, et al, 2010) for R environment (R Development Core Team, 2012) after binning the data into 0.1 intervals.

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While the MI calculation was performed by applying already available scripts, in the case of dCor we needed to develop a novel software that parallelizes the several steps of the computation making it possible the application of this statistics to large genomic data like phylogenetic profiles.

The strategy that we adopted is schematically shown in figure 4. The first part of the procedure (Process 1) represents the phase of data preparation and includes three steps. The step 1 consists in the construction of the matrix with

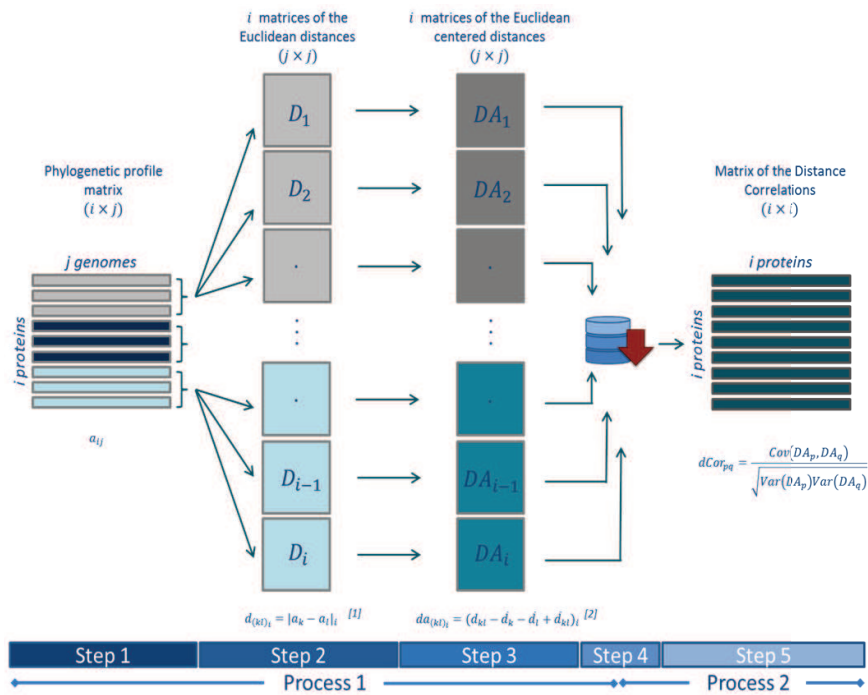


Figure 4. Workflow. The calculation of the distance correlation has been divided into two processes. By the Process 1, a “split-apply” strategy is adopted (Step 1): the phylogenetic profile matrix is divided in subsets of profiles that are contemporary processed for calculations (groups of bars in different colors). From each single phylogenetic profile is calculated the matrix of the Euclidean distances (Step 2). Each element of the Euclidean distance matrix is calculated as the absolute difference between the k and l element of the i -th phylogenetic profile. The Euclidean distance matrixes are represented by light grey or light blue squares in the figure. Then each element of the Euclidean distances matrix is “centered” by following the formula [2] as reported in the figure at Step 3, obtaining the matrix of the centered distances represented by dark gray and dark blue squares. Then, each matrix of the centered distances is saved as a binary file (Step 4) creating a repository. The final step (Step 5) in Process 2, represents the calculation of the distance correlation from each pair of matrixes of the centered distances read from the binary files in the database.

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elements a_{ij} containing the phylogenetic profiles of i proteins of a given organism, constructed using a reference set of size j genomes; starting from this data, the i Euclidean $j \times j$ distance matrices D with elements $d_{(kl)i} = |a_k - a_l|_i$ between the j elements of the i -th phylogenetic profile (with k and l from 1 to j) are calculated (step2); the step3 regards the calculation of the centered Euclidean distances DA of elements $da_{kl} = d_{kl} - \bar{d}_k - \bar{d}_l + \bar{d}_{kl}$ where

$\bar{d}_k = \frac{1}{n} \sum_{k=1}^n d_{kl}$ is the average calculated on the rows of the distance matrix;

$\bar{d}_l = \frac{1}{n} \sum_{l=1}^n d_{kl}$ is the average calculated on the columns of the distance matrix;

$\bar{d}_{kl} = \frac{1}{n^2} \sum_{k,l=1}^n d_{kl}$ is the average calculated on all the elements of the distance matrix;

with $k = l = 1, \dots, n = 1, \dots, j$.

This is the crucial point of the procedure, in fact, the calculation of centered Euclidean matrices depends on sample size, according to a polynomial law. This hampers the application of the method to a large data set on a standard workstation. To reduce the algorithm complexity we applied a “split-apply-combine” strategy developing a code that subdivides and parallelizes this step. Furthermore, to reduce RAM requirements, matrices resulting from step 3 are stored as binary files in a repository (step4).

To perform the second part of the procedure (Process 2), a second code was developed to read pairs of binary files (p, q) and to calculate the corresponding

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distance correlation $dCor_{pq} = \frac{Cov(DA_p, DA_q)}{\sqrt{Var(DA_p)Var(DA_q)}}$ where $Var(DA_p)$ and $Var(DA_q)$ are variances of matrices DA_p and DA_q and $Cov(DA_p, DA_q)$ is their covariance.

Each profile of the four sets of phylogenetic profiles (constructed using the reference sets reported in table I) was compared with all the others in the same data set. This resulted in eight data sets of PPI predictions, for *S. cerevisiae* and *E. coli* with the corresponding dCor values and eight datasets with the corresponding MI scores.

In order to perform an assessment of the method, we derived two sets of gold standards both for *S. cerevisiae* and *E. coli*. The first one (GS-fun) was derived from the metabolic pathways in KEGG database (Kanehisa & Goto, 2000), and includes, as True Positives (TPs), pairs of functionally related proteins (TP-fun) belonging to the same pathway. In the second set of gold standards (GS-phy), TPs are pairs of physically interacting proteins (TP-phy) derived from the STRING database (Franceschini, et al, 2013) considering protein pairs with exclusively experimental evidence of a physical interaction. To compose True Negatives sets (TN) of both functional (TN-fun) and physical (TN-phy) interactions, we developed a graph-based algorithm to explore data in KEGG or in STRING databases (figure 5). Data were represented as networks where interconnected nodes are, in one case, proteins of the same pathway, while in the other proteins of the same complex. The algorithm automatically explores the networks to identify protein pairs whose shortest path between their sub-graph was higher or equal to five (TN).

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To assess the performance of our predictions, a ten-fold cross-validation

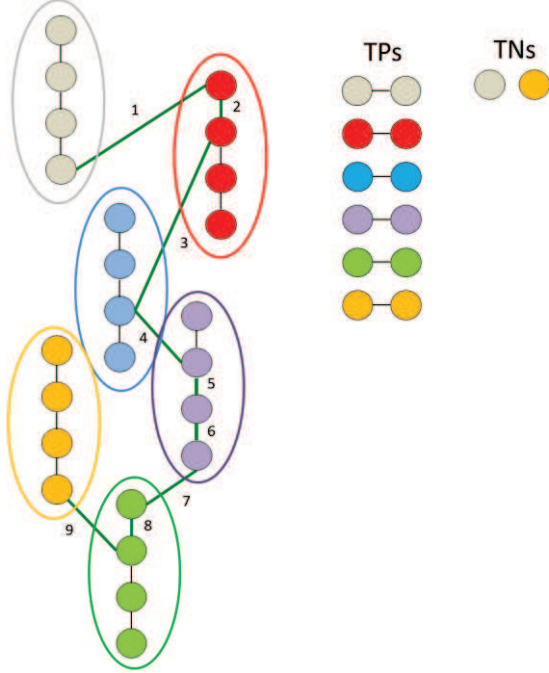


Figure 5. Gold standard construction. A graph based algorithm was developed to construct gold standards. Data from KEGG and STRING databases are represented as graphs, where proteins in the same metabolic pathway (KEGG) or in the same complex (STRING) are, represented as nodes of the same color in the figure. True Positives are derived as protein pairs in the same pathway or in the same complex. To find True Negatives shortest paths between nodes in the graphs are calculated (green thick line) and those pairs, which shortest path is equal or higher than 5 are selected as TNs.

procedure was applied. Each dataset of protein pairs was randomly sub-divided in independent subsets of equal size (ten subsets of 3465677 protein pairs each for yeast data and ten subsets of 2011522 protein pairs each for *E. coli* data) and the corresponding specificity and sensitivity values were calculated according to:

$$Sensitivity = \frac{TP}{TP + FN}$$

$$Specificity = \frac{TN}{TN + FP}$$

where TP , FP , TN , FN are the number of true and false positives and negatives obtained by comparing protein pairs (at each interval of dCor and MI values binning them at 0.1 intervals) with gold standards. As a measure of the prediction accuracy, the Area Under the ROC Curve (AUC) was calculated according to the Gini's formula:

$$AUC = \frac{1}{2} \sum_i ((X_i - X_{i-1})(Y_i + Y_{i+1})) \quad [3]$$

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where $X_i = 1 - \textit{Specificity}$ and $Y_i = \textit{Sensitivity}$ at the i -th bin of dCor and MI.

Results, obtained for each assessment performed on phylogenetic profiles constructed using each reference set (RS), are shown as scatter dot plots in figure 6 where means and standard deviations are indicated as horizontal and vertical bars respectively. In all cases, the predictive performance of

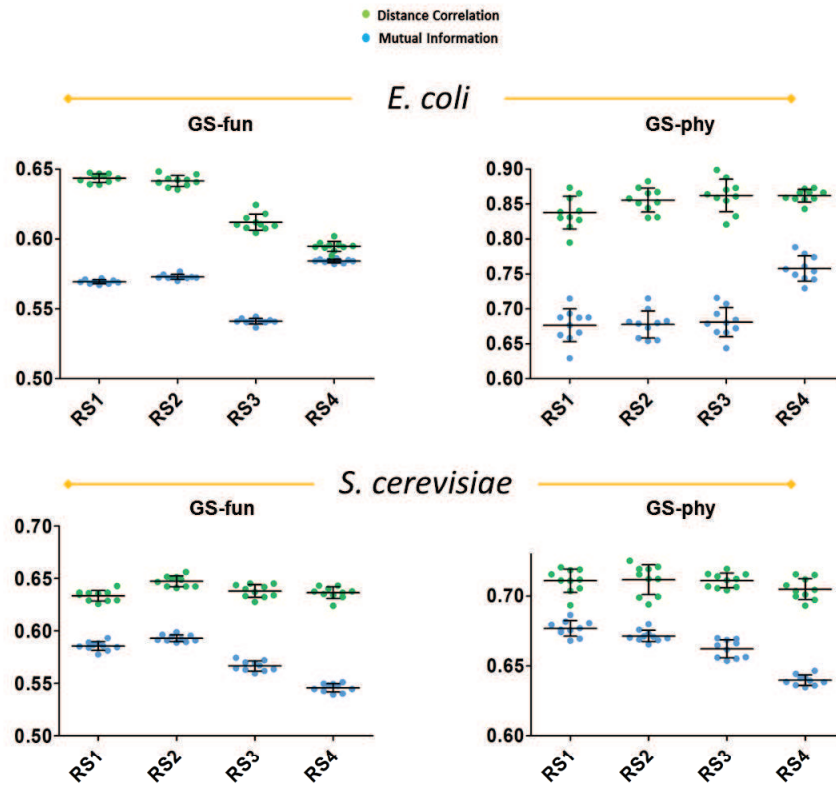


Figure 6. Assessment results. A ten-fold cross-validation was performed to assess predictive performances by using dCor (green dots) and MI (blue dots) to measure phylogenetic profile similarity. Each dot represents the prediction accuracy calculated as the Area Under the ROC Curve (AUC). The phylogenetic profiles of *E.coli* and *S.cerevisiae* were constructed comparing protein sequences with those from genomes in four reference sets (RS1, RS2, RS3 and RS4). In order to assess the performance of our method in predicting both functional and physical interactions, gold standards were derived from KEGG database as “functionally related protein” (GS-fun) and from STRING database, as “physically interacting proteins” (GS-phy; considering only the protein pairs for which evidence of a physical interaction was available).

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phylogenetic profiling using dCor (green dots) outperforms that one obtained using MI (blue dots). In particular, in the functional interaction predictions, AUC mean values range from 0.60 to 0.64 for dCor and from 0.53 to 0.58 for MI, in the case of *E. coli* and from 0.63 to 0.65 for dCor and from 0.55 to 0.59 for MI, in the case of *S. cerevisiae*. Even better results were obtained in predicting physical interactions, AUC mean values ranging between 0.84 and 0.86 for dCor and between 0.68 and 0.76 for MI for *E.coli*, and between 0.70 and 0.71 for dCor and between 0.64 and 0.68 for MI in the case of *S. cerevisiae*. Considering overall data, the best predictive performances were achieved with the reference sets RS1 and RS2 that contain the highest number of genomes

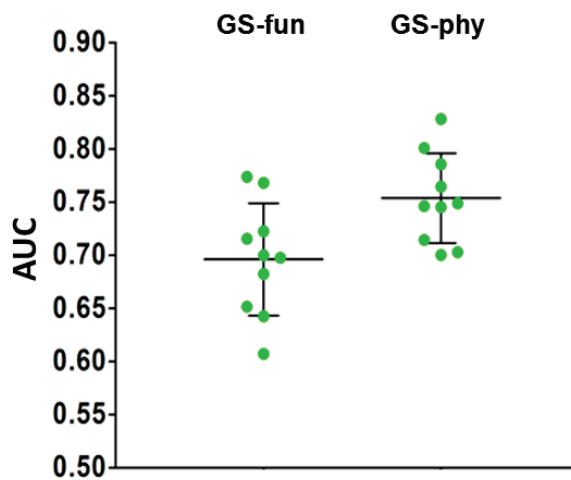


Figure 7. *P. falciparum* assessment results. The phylogenetic profiles of *P. falciparum* were constructed comparing their protein sequences with protein sequences from genomes in the reference sets RS2. The distance correlation was used to score profile similarity. Predictions were assessed by the comparison with the gold standards derived from KEGG (GS-fun) and the gold standards derived from STRING (GS-phy).

(774 and 669 respectively).

However, RS2 appears to outperform RS1 in predicting physical interactions in *E.coli* and the functional ones in yeast.

For this reason, we proceeded with the construction of a novel set of phylogenetic profiles for *P. falciparum* using the reference set RS2 and the distance correlation, as profile similarity measures. Results obtained in the assessment procedure are

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shown in figure 7 as scatter dot plots. As in the case of *E. coli* and *S. cerevisiae* the prediction of physically interactions (AUC mean value = 0.75) gives better results compared with those of the functional interactions (AUC mean value= to 0.69).

4.1.a A gold standard-independent validation: the case of the apicoplast proteins of *P. falciparum*.

Organelle proteins in *P. falciparum* are of particular interest as candidates for drug development in that they are potentially specific for the parasite and absent in the host cells. In this context, the apicoplast proteins appear of interest because of their bacterial origin, and because they are involved in biological processes essential for the parasite life. As shown in the figure 8, the apicoplast originates from a secondary endosymbiosis event occurred when an eukaryotic red alga engulfed a cyanobacterium and then was subsequently engulfed by a eukaryotic cell (McFadden, et al, 1996). During the evolution, several gene transfer events occurred from the cyanobacterium to the red alga genome and then from that to the nuclear genome of the eukaryotic host cell. This made the apicomplexan genomes a sort of mosaic of genes from different origins. Nowadays the apicoplast genome encodes a small number of proteins involved in the metabolic pathways that take place in the organelle (Wilson, et al, 1996), and the majority of the proteins (of bacterial and plant origin) that are necessary to complete its functionality are encoded by the nuclear genome and targeted to the apicoplast by localization signals (Martin & Herrmann, 1998; Foth, et al, 2003).

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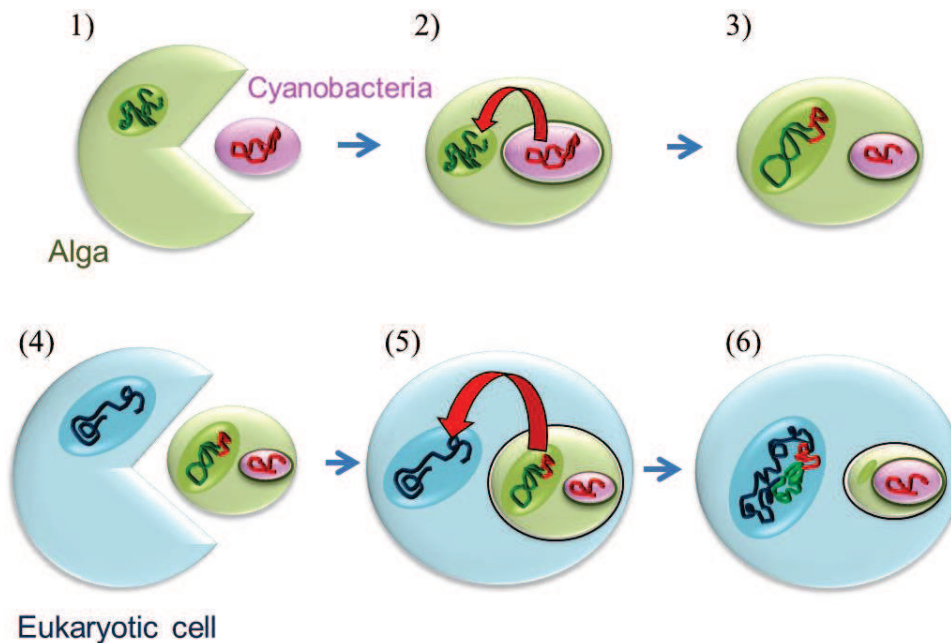


Figure 8. Evolutionary origin of the apicoplast. The apicoplast derived from a double event of endosymbiosis. In the first endosymbiosis a cyanobacteria is engulfed by an alga (1) and subsequent gene transfer events happened from the cyanobacterium to the alga genome (2-3). A second endosymbiotic event occurred when the alga was engulfed by an eukaryotic cell (4) determining a second series of gene transfers (red arrow) from the alga's nucleus to the eukaryotic one (5-6).

Methods have been developed to predict apicoplast proteins on the basis of target peptide sequence (PATS, PlasmoAP and ApicoAP: Zuegge, et al, 2001, Foth, et al, 2003, Cilingir, et al, 2012), however, attempts to define a consensus for this localization signal failed. Furthermore the low number of experimentally validated apicoplast proteins makes problematic the development of algorithms based on the usage of a training set.

In this work, we utilized phylogenetic profiles of *P. falciparum* to investigate evolutionary relationships of known apicoplast proteins, and to evaluate the possibility to exploit this method in the prediction of novel ones.

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To do this, we first established a threshold of the dCor on the basis of the TP/FP ratio *versus* the genome coverage. We choose a value that guarantees a good enough balance between the coverage of the parasite proteome, and thus a sufficient number of predicted interactions, and an acceptable percentage of possible FPs. We choose the threshold $dCor > 0.6$, that corresponds to 1928 proteins involved in 46712 predicted interactions with a ratio of TP/FP equal to 32.9 and hence a percentage of 3% of possible FPs (figure 9).

The resulting data set of protein pairs was represented as a network by Cytoscape (version 2.8.3; Shannon, et al, 2003), in which (figure 10) each protein is shown as a node (dots in figure) and evolutionary associations between proteins, as established by their dCor value, as edges.

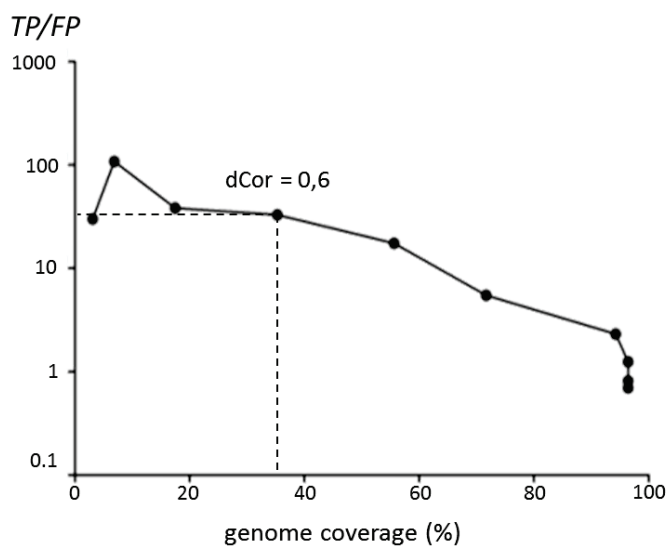


Figure 9. Assessment of *P. falciparum* phylogenetic profiling. At each dCor value, the TP/FP ratio and the percentage of proteins encoded by the *P. falciparum* genome (genome coverage) are calculated. We establish a threshold of $dCor = 0.6$, that corresponds to a genome coverage of 35.3% and a TP/FP of 32.87.

Then, to confirm the predicted associations, we exploited information in the ApiLoc Database (<http://apiloc.biochem.unimelb.edu.au/apiloc/apiloc>) regarding experimental evidence on sub-cellular localization of *P. falciparum* proteins. 23 out of 40 apicoplast proteins selected from the ApiLoc Database

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were found to map on the network of phylogenetic profiles. As shown in figure 10, known apicoplast proteins localize in two separated regions of the network. 15 proteins reside in a central area of the main network (figure 10, green nodes), while the remaining 8 proteins (figure 10, red nodes) remain confined in a small network that has no connections with the main one. This result strongly suggests that the small network includes proteins encoded by genes originally derived from the cyanobacterium genome and hence evolutionary unrelated with the rest of the proteome. On the other hand, apicoplast proteins encoded by genes with “plant origin” are not sparse, but they localize to a limited region of the main network, reflecting their common evolution.

Then, we focused on the subnetwork containing proteins of bacterial origin. This contains 60 proteins, which are involved in pathways known to take place in the apicoplast such as the type II fatty acid synthesis (FASII) or the iron-sulphur cluster synthesis (Lim, et al, 2010). In particular, we found that three subunits of the Pyruvate Dehydrogenase (PDH) complex in ApiLoc, map in this subnetwork. The PDH complex, that is involved in essential *Plasmodium* processes (Pei, et al, 2010), is formed by four subunits (E1 α , E1 β , E2 and E3). No information is available on the sub-cellular localization of the subunit E1 β (PF14_0441) and no bioinformatics tool predicted it as an apicoplast protein. As shown in the figure (magnification in figure 10), we found that this protein is linked to the other three subunits of the PDH complex in the subnetwork. This result represents a further validation of the phylogenetic profiling that we constructed for *P. falciparum* and opens new perspectives on its potential applications in developing a novel class of predictors.

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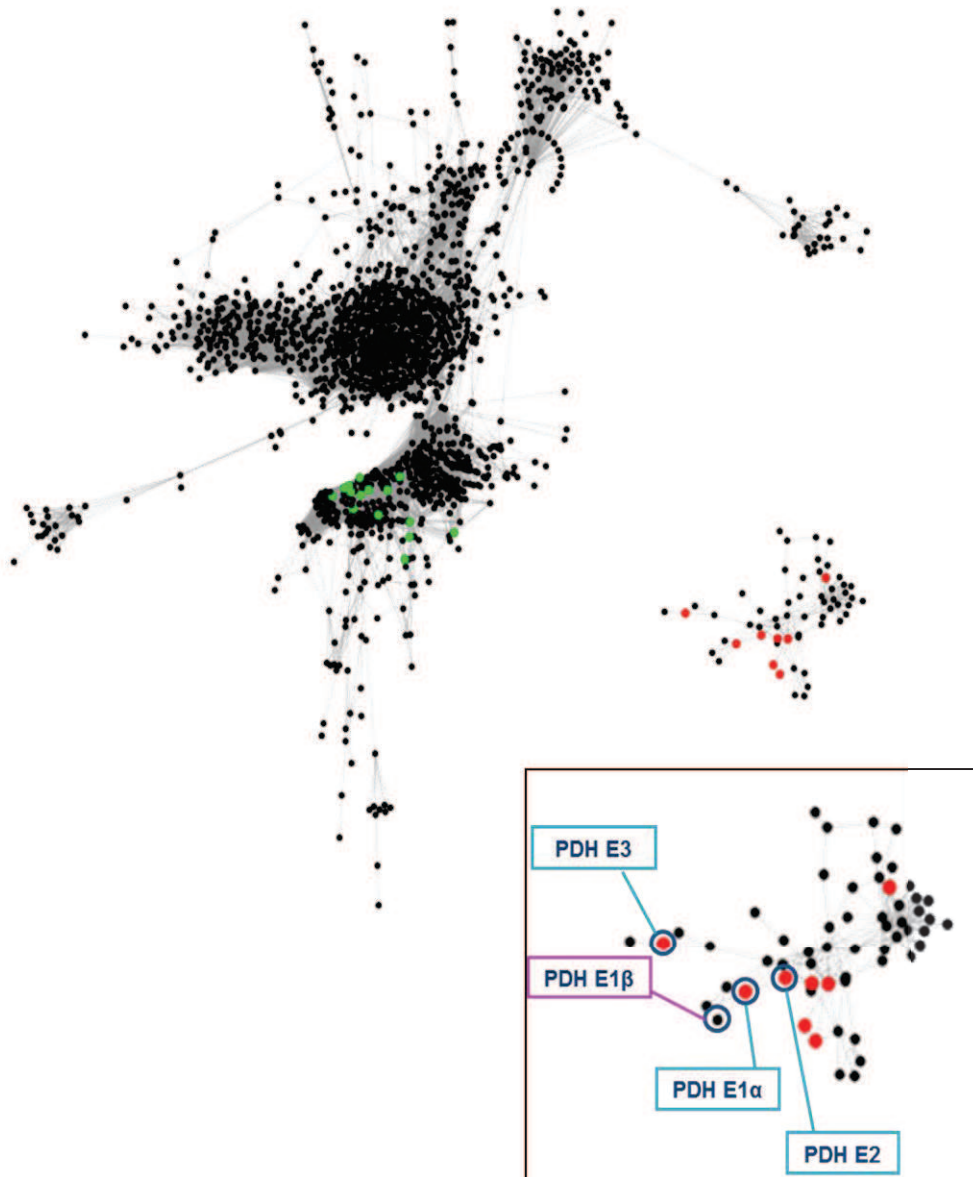


Figure 10. *P. falciparum* phylogenetic profiles relationships are represented as a network. We selected a subset of protein pairs of *P. falciparum* with a phylogenetic profile similarity higher than 0.6. The proteins and their interactions were visualized by Cytoscape (v2.8.3) as a network. Experimentally validated apicoplast targeted proteins are shown as colored nodes. Green nodes are apicoplast proteins with an hypothetical red alga origin, while red ones represent proteins encoded by genes of bacterial origin. In the inset the “bacterial-related” network is highlighted. The proteins belonging to the PDH complex are in blue circle.

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4.2 Rosetta stone data of *P. falciparum*.

Rosetta stone is a method to predict PPIs, based on the detection of “rosetta stone proteins” in genomes of a reference set (Enright, et al, 1999; Marcotte, et al, 2002). The basic idea is that two not-paralog proteins are predicted to be functionally related if they are similar to two different not-overlapping domains of the same protein in the reference set (figure 11).

We utilized the reference set RS1 (774 genomes; 4×10^6 protein sequences) to

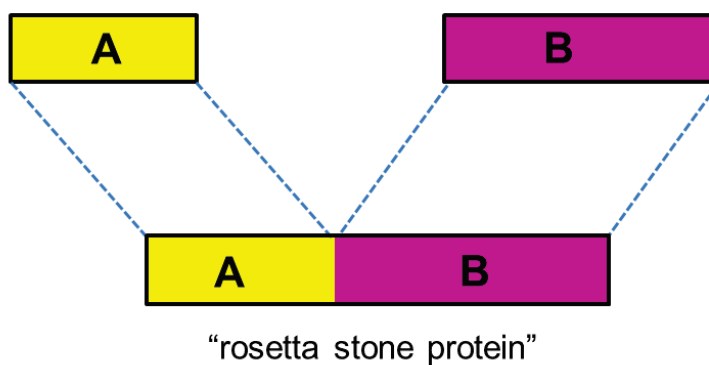


Figure 11. Rosetta stone method. The method predicts the interaction between two proteins A and B (yellow and purple bars) if they have, in another organism, the orthologs fused in a multi-domain protein (“rosetta stone protein”). The orthologs of the target proteins are detected by Smith-Watermann sequence alignment. Matches are considered only if the resulting E-value is lower than 10^{-6} and the sequence identity is higher than 30%.

construct novel rosetta stone fusion data of *P. falciparum* proteins.

The protein sequences of *P. falciparum* were aligned against the proteins derived from the genomes in the

reference set by the Smith-Watermann alignment algorithm available in the FASTA package (version 36, Pearson & Lipman, 1988). A match between a parasite protein and a “rosetta-stone protein” was considered if E-value of the alignment is lower than 10^{-6} and sequence identity higher than 30%. *P. falciparum* paralogs were excluded from the analysis, since proteins with a percentage of identity higher than 50% were discarded.

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In order to establish the likelihood of the predicted functional interaction, we calculated the probability that a fusion event occurred by chance. As proposed in (Marcotte and Marcotte, 2002), we used the hypergeometric distribution to calculate the probability of observing k fusion events between two proteins that occur n and m times in a database of size N genes, according to:

$$p(k|n, m, N) = \frac{\binom{n}{k} \binom{N-n}{m-k}}{\binom{N}{m}} = \frac{n!(N-n)!m!(N-m)!}{(n-k)!k!(m-k)!(N-n-m+k)!N!} \quad [4]$$

To calculate large factorials, the logarithm of the probability using Sterling's approximation was calculated. Finally, the probability to observe k or more fusion events by chance is equal to:

$$p(\text{fusions} \geq k|n, m, N) = 1 - \sum_{i=0}^{k-1} p(i|n, m, N) \quad [5]$$

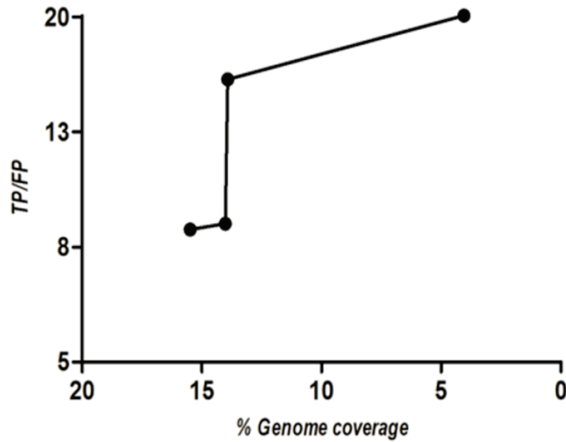


Figure 12. Rosetta stone assessment. TP/FP ratio and genome coverage calculated for each of rosetta stone probability scores.

The lower the probability value, the more significant the inferred interaction is.

846 *P. falciparum* proteins, involved in 620 interactions were predicted as functionally related by this procedure. We evaluated the predictive performance of the results comparing the obtained

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data with the functional gold standards (GS-fun) already used in phylogenetic profiling. Figure 12 shows the outcome of the assessment procedure. Although the predicted interactions regard a limited number of proteins, our data show a good predictive performance (the ratio TP/FP ranges between 8.5 and 20.0) that is higher than the previously published (TP/FP < 10) (Date, et al, 2006).

4.3 Expression profiling of *P. falciparum* blood stages.

The prediction of PPIs from expression data is based on the observation that proteins in the same complex, or involved in the same pathway, are often encoded by co-expressed genes. Many transcriptomic data are now available for *P. falciparum*, that can be utilized to determine gene co-expression. We focused on microarray-based expression data for which both asexual and sexual blood stages (gametocytes) have been analyzed (Le Roch, et al, 2003; Young, et al, 2005).

Transcriptomic data are accessible for early and late rings, early and late trophozoites, early and late schizonts, merozoites and gametocytes (Le Roch, et al, 2003). For asexual stages two data sets are available corresponding to two independent cultures synchronized using different methods (sorbitol and temperature). Two additional gene-expression data sets are also available for sexual stages from samples collected daily from two different *P. falciparum* lines (NF54 and 3D7). The first data set consists of a time course of NF54 gametocytes (from day 1 to day 13) while the second of a time course of 3D7 gametocytes (days 1, 2, 3, 6, 8 and 12) (Young, et al, 2005).

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Starting from these data, we constructed different profiles as summarized in table II.

Table II: length and composition of the expression profiles

	<i>Total</i> <i>number of</i> <i>time points</i>	<i>Asexual stages</i>		<i>Sexual stages</i>	
		<i>Sorbitol</i> <i>synchronization</i>	<i>Temperature</i> <i>synchronization</i>	<i>3D7</i> <i>clone</i>	<i>NF54</i> <i>clone</i>
Profile 1	26	7 ^a	7 ^a	6 ^b	6 ^b
Profile 2	14	7 ^a	7 ^a	-	-
Profile 3	12	-	-	6 ^b	6 ^b
Profile 4	20	7 ^a	7 ^a	6 ^b	-
Profile 5	15	7 ^a	7 ^a	1 ^a	-

^a from Le Roch, et al, 2003; ^b from Young et al, 2005.

Raw expression data were downloaded from PlasmoDB Database (<http://plasmodb.org>). Each expression profile value was then log2 transformed and normalized according to:

$$x_{normalized} = \log_2 x_i / \bar{x}_{profile} \quad [6]$$

where $x_{normalized}$ is the normalized value of expression calculated for the i -th x element of the expression profile and where $\bar{x}_{profile}$ is the mean calculated along the profile.

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For each pair of profiles the corresponding Pearson's correlation coefficient was calculated to measure profile similarity (the *cor* function (Becker, et al, 1988) in R environment). We assessed the results using GS-fun gold standard obtained from KEGG database. The Positive Predictive Value (PPV) was calculated according to

$$PPV = \frac{TP}{TP + FP} \quad [7]$$

where *TP* and *FP* were calculated at each Pearson's correlation value. The results of the assessments are reported in figure 13. We found that the best PPVs were obtained using profiles 2 and 5 while the predictive performances using the other profiles was significantly lower.

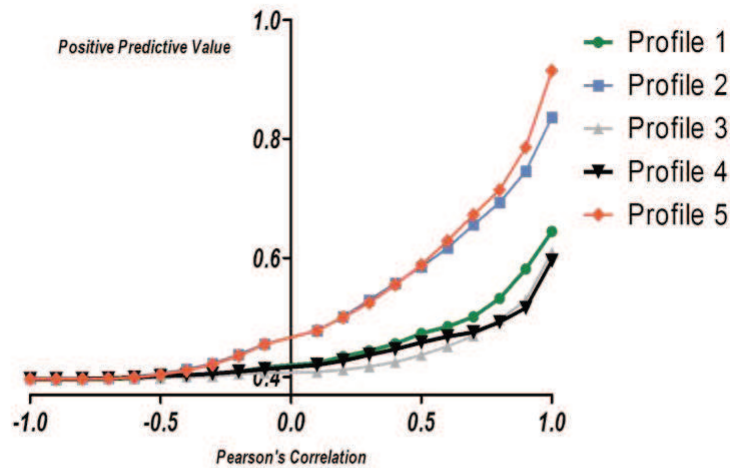


Figure 13. Gene expression assessment. The Positive Predictive Value was calculated for each value of the Pearson's coefficient obtained by comparing gene expression profiles in each data set (Profile 1-5).

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4.4 Prediction of a global *P. falciparum* interactome.

We utilized phylogenetic profiles, rosetta stone proteins and gene expression data to predict a global PPI network for *P. falciparum*. We applied the Bayesian approach proposed by Jansen (Jansen, et al, 2003) to integrate the three data sets.

Protein pairs in each data set were grouped binning the corresponding value of Pearson's correlation, distance correlation and rosetta protein probability. Each group of protein pairs in each bin was compared with the gold standards of functional interactions (GS-fun) and the corresponding TP/FP ratio was calculated (Table III). This TP/FP value was then associated to each protein pair in the bin as the score *LR*.

Table III. TP/FP ratio calculated for each bin of the dCor, rosetta stone probability and Pearson's coefficient

Phylogenetic profile		Rosetta stone data		Expression data	
bin	TP/FP	bin	TP/FP	bin	TP/FP
0 - 0.1	0.696261	< 5	0	-0.9 - -0.8	0.65716
0.1 - 0.2	0.81191	5 - 6	8.75	-0.8 - -0.7	0.65724
0.2 - 0.3	1.24575	6 - 7	8.5	-0.7 - -0.6	0.65742
0.3 - 0.4	2.3144	7 - 8	15.5	-0.6 - -0.5	0.65942
0.4 - 0.5	5.47423	else	20	-0.5 - -0.4	0.66545
0.5 - 0.6	17.4959			-0.4 - -0.3	0.6781
0.6 - 0.7	32.8667			-0.3 - -0.2	0.69691
0.7 - 0.8	38.2857			-0.2 - -0.1	0.72763
0.8 - 0.9	108			-0.1 - 0	0.7715
0.9 - 1	30			0 - 0.1	0.83451
				0.1 - 0.2	0.9149
				0.2 - 0.3	1.0003
				0.3 - 0.4	1.10305
				0.4 - 0.5	1.24752
				0.5 - 0.6	1.43028
				0.6 - 0.7	1.69389
				0.7 - 0.8	2.05295
				0.8 - 0.9	2.50138
				0.9 - 1	3.67123
				1	10.6897

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A global score LR_G was obtained by multiplying the single ones derived from each data set,

$$LR_G = LR_P \times LR_R \times LR_E \quad [8]$$

here LR_P , LR_R and LR_E are the scores from the phylogenetic profiles, rosetta stone proteins and expression data respectively.

An assessment of the global predictive performance was performed and compared with those derived from each single data set by using the gold standards GS-fun. Results are shown in figure 14 as a plot of the TP/FP for each

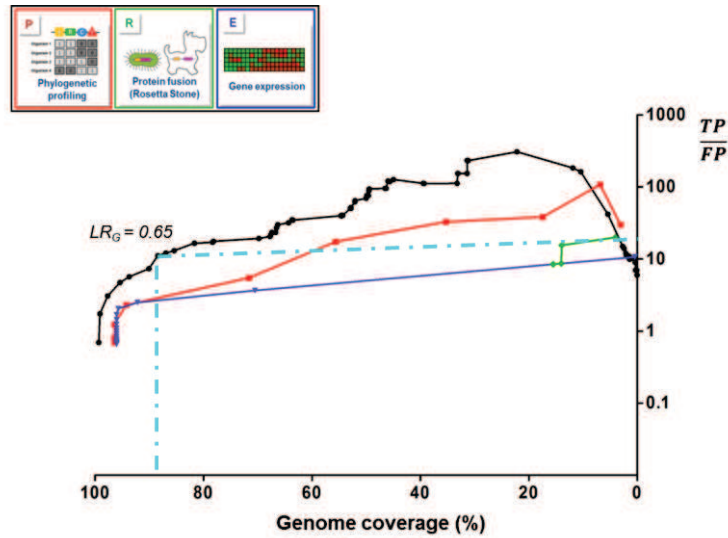


Figure 14. Assessment of the *P. falciparum* PPIs. The assessments of PPIs predicted by phylogenetic profiling (red line), rosetta stone method (green line), gene expression data (blue line) and by the Bayesian approach (black line) were performed. Accuracy (TP/FP) and genome coverage are calculated for each of dCor, rosetta stone probability, Pearson's coefficient and for the global score LR_G . A threshold was established for LR_G equal to 0,65 that corresponds (light blue line) to more than 88% of genome coverage and to a ratio TP/FP equal to 11.1.

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LR_G value *versus* the genome coverage.

Our results show that the integration of data results in an improvement of the accuracy in predicting PPIs. The TP/FP ratios of the predictions obtained using integrated data sets is about ten-fold higher compared with the TP/FP ratios obtained using the single data sets. In order to derive a PPI network covering a significant portion of the proteins encoded by *P. falciparum* genome and ensuring a sufficiently low number of expected FPs, we choose a LR_G value equal to 0.6 (88% of genome coverage; 9% of FPs) as a threshold. The resulting PPI network includes 4833 proteins involved in 436115 interactions (figure 15).

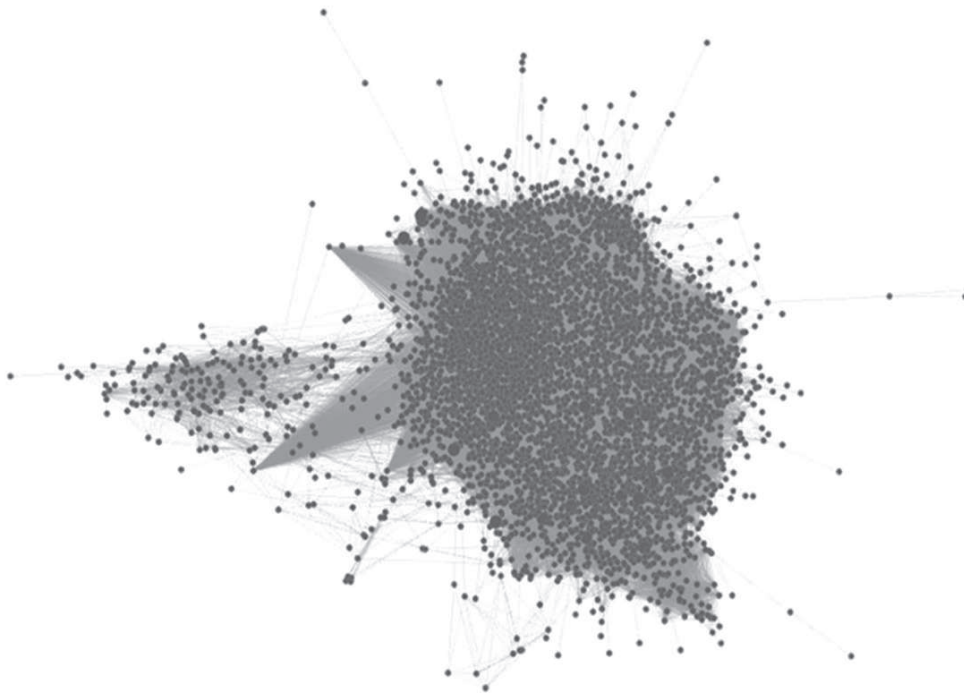


Figure 15. *P. falciparum* PPI network. Predicted PPI network is represented as a graph. Each node represents a protein while edges represent predicted interactions.

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4.5 Topological analysis of *P. falciparum* global interactome.

Biological networks are characterized by specific topological properties that distinguish them from random. First, biological networks are scale-free (panel a of figure 16), that is they have few nodes with a high number of connections (high node degree) and many nodes with few connections (low node degree)

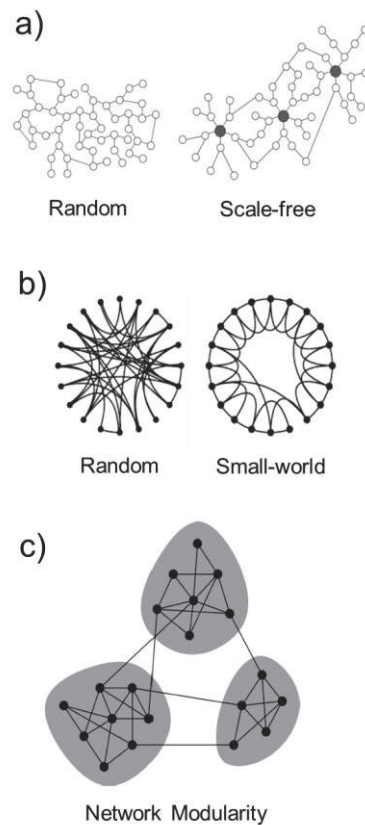


Figure 16. Topological properties of biological networks.

Biological networks have a scale-free feature (panel a). In these networks few nodes have a high number of connections (full nodes), while the majority of them are poorly connected (empty nodes).

The small-world property is another feature of biological networks (panel b). The majority of nodes, even if not directly connected, can be reached from every other node by few steps.

Biological networks are modular (panel c). Groups of highly connected nodes (grey areas) are poorly connected.

(Uetz, et al, 2000; Ito, et al, 2001). This results in a node degree distribution that follows a power-law $y \approx x^{-\gamma}$ where γ ranges from 2 to 4 (Barabási & Albert, 1999). Second, biological networks have small-world property (panel b in figure 16), that is the majority of nodes, even if not directly connected, can be reached by a small number of paths (Watts & Strogatz, 1998). Finally,

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biological networks are modular. They are formed by highly connected groups of nodes that are poorly connected to each other (panel c of figure 16) (Newman, 2006). Modularity of a network can be estimated by comparing the distribution of the average clustering coefficients with that one of a random network. The clustering coefficient is defined as the ratio between all possible

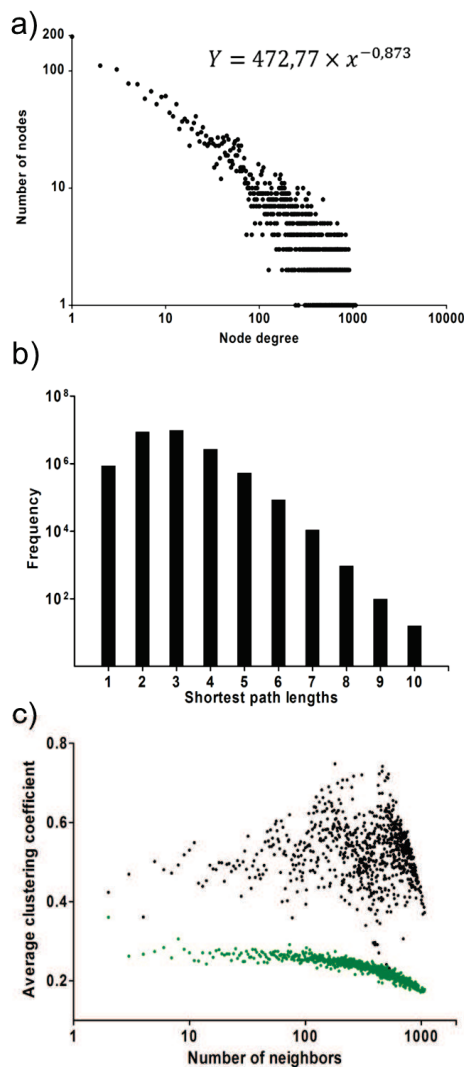


Figure 17. Features of *P. falciparum* interaction network. We analyzed the interactions above the threshold of 0.6 of likelihood score, calculating:

a) The distribution of node degree: each dot represents the number of nodes that have a specific number of connections (degree). The power law fitting with the data is reported on the top right of the panel. Note the log-scale on x and y axes.

b) The shortest path lengths distribution: bar graph of the distribution of the shortest paths length (Y-axis in log-scale).

c) The distribution of the average clustering coefficient: each black dot represents the average of the clustering coefficient calculated for all nodes with the same number of neighbors of *P. falciparum* network, while the green dots represent the same data calculated for a random network of equal size (X-axis in log-scale).

and the actual edges between first neighbors of a given node. The distribution is obtained by calculating the average of the clustering coefficient of nodes with 1,2, 3,...,n first neighbors.

To analyze the PPI network obtained for *P. falciparum*, we used the

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Network Analysis tool available in Cytoscape (version 2.8.3, Shannon, et al, 2003), and results are shown in figure 17. In panel a of figure 17, it is shown the node degree distribution that fits the power law $y = 472.77 \times x^{-0.873}$. We noticed that the γ value is lower than the one expected for biological networks. This means that a high number of nodes has high node degree in *P. falciparum* PPI network. This result supports previous observations (La Count, et al, 2005; Date, et al, 2006) indicating that *P. falciparum* interactome is more interconnected than those of other organisms. Panel b of figure 17 shows the distribution of the shortest path lengths, we observed that the majority of node pairs is characterized by shortest path lengths lower than 5 (96,56%), revealing the “small world” character of the *P. falciparum* interactome. In panel c of figure 17, the distribution of the average clustering coefficients are reported for both real (full dots) and randomized (green dots) *P. falciparum* interactome. The two distributions significantly differ. Average clustering coefficients obtained for the real interactome are consistently higher than those obtained for the randomized one (the global average clustering coefficient of the real interactome is equal to 0.493, while it is equal to 0.242 for the randomized one).

4.6 Stage-specific lipid raft interactomes during *P. falciparum* blood stage development.

The prediction of a global interactome does not take into account timing of expression and sub-cellular localization of the proteins involved. To overcome this problem, it can be filtered with proteomic data. The host lab performed a proteomic analysis of membrane microdomains (lipid rafts) isolated from

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different *P. falciparum* blood stages. Lipid rafts, characterized in many different organisms, are involved in important cellular processes such as signaling, trafficking, membrane fusion events and gained particular interest for their role in host cell invasion by different pathogens, including *Plasmodium*.

The host laboratory performed mass spectrometry analysis of *P. falciparum* lipid rafts from trophozoites, early and late schizonts and sexual gametocytes, collecting parasite samples from synchronous cultures (figure 18). We used the four proteomic data sets to filter the predicted PPI network of *P. falciparum* and derive the stage-specific lipid-raft interactomes. In table IV we reported the numbers of proteins experimentally identified by mass spectrometry, the number of proteins and connections of the obtained interactomes.

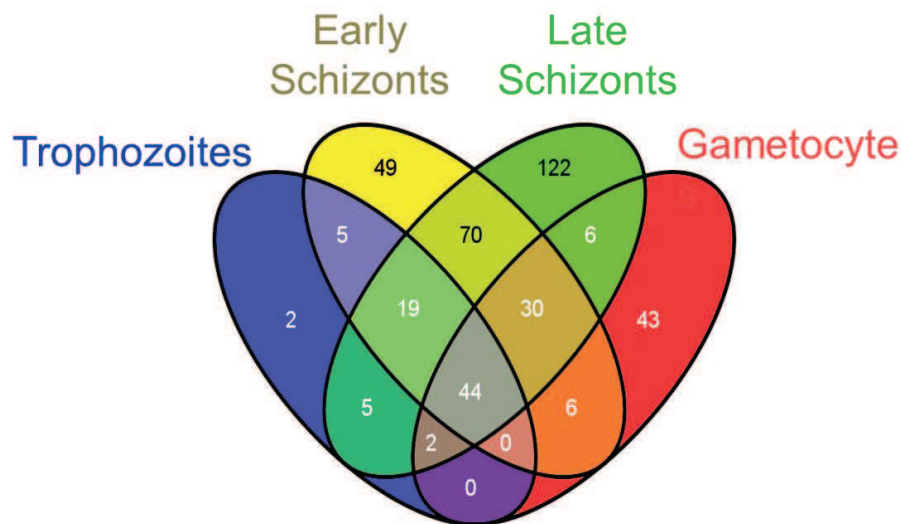


Figure 18. Summary and overlap of the mass spectrometry data of lipid rafts. Venn diagram of mass spectrometry data of lipid rafts from four *P. falciparum* developmental stages

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Table IV. Numbers of the identifications and characteristics of the stage-related networks

	<i>Experimentally identified proteins</i>	<i># proteins in the raft-related network</i>	<i># connections</i>
Young trophozoites	77	70	214
Early schizonts	223	213	1159
Late schizonts	298	282	2141
Stage IV gametocytes	131	124	358

In all cases we found that the lipid raft-associated proteins are involved in highly connected networks. In order to assess the probability that this can be obtained by chance, we performed a random simulation test selecting ten protein sets, from the global PPI network, of the same size of proteomic data sets.

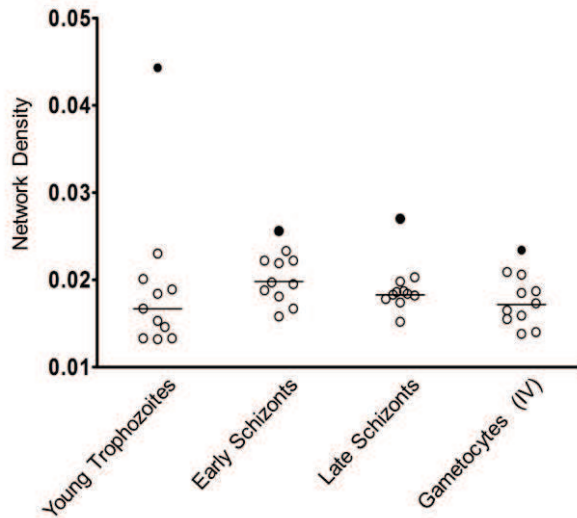


Figure 19. Simulation test. The network densities of lipid-raft PPI networks (empty dots) are compared with network densities of PPI networks obtained by randomly choosing ten protein data sets of equal size (empty dots).

Comparative analysis was performed calculating the Density values according to $D = \frac{2E}{N(N-1)}$ (where E is the number of connections observed in a given networks and $N(N-1)$ the number of all possible connections between N nodes), which provides a measure of the internal connectivity of a network.

Results are shown in figure 19 as scatter dot plots. In all cases we found that the

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mean density values (horizontal bars) of interactomes derived from randomly chosen proteins (empty dots) are lower than those obtained from the predicted interactomes (full dots).

4.6.a Analysis of dynamic interactions.

Once established that the stage-specific interactomes significantly differ from those obtained using random data sets, we proceeded with their characterization. One of our main interests, is to gain insights on the dynamics of membrane lipid rafts during the parasite development. To this aim, we applied a methodology (Srihari & Leong, 2012) that measure the percentage of conservation of PPIs.

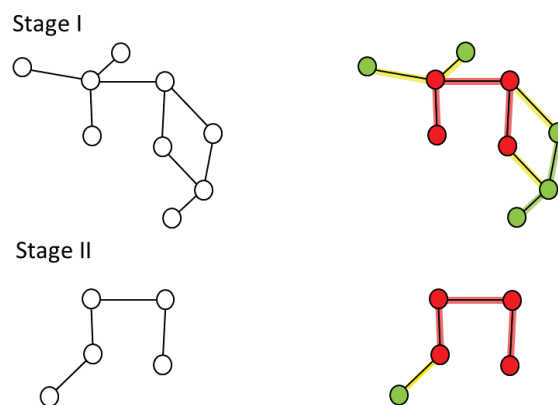


Figure 20. “Static” and “dynamic” classification. Stage-specific proteins (green nodes) are classified as “dynamic” (D), conserved proteins (red nodes) as “static” (S). Edges are classified as *D*, “static-dynamic” (SD) or *S* if they connect two D proteins (green edges), a S and a D protein (yellow edges) or two S proteins (red edges), respectively.

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Based on comparative analysis of lipid raft proteomes of the four examined stages, a stage-specific protein is classified as “dynamic”, while a protein conserved in at least two stages is considered as “static”. Accordingly, PPIs are classified as “dynamic” (*D*) if they occur between two dynamic proteins, “static/dynamic” (*SD*) if they connect a “static” with a “dynamic” protein and “static” and (*S*) if the predicted interaction occurs between two “static” proteins (figure 20).

Stage	# proteins	# interactions	Interaction type		
			<i>D</i>	<i>SD</i>	<i>S</i>
Young Trophozoites	70	214	0	0	214 (100%)
Early schizonts	213	1159	61 (5.2%)	302 (26.1%)	796 (68.7%)
Late schizonts	282	2141	461 (21.5%)	909 (42.5%)	771 (36%)
Stage IV Gametocyte	124	358	23 (6.4%)	40 (11.2%)	295 (82.4%)

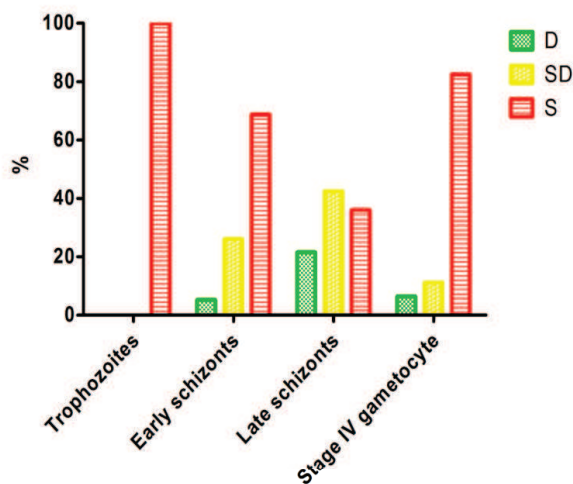


Figure 21. Dynamic of the *P. falciparum* lipid-raft interactomes. Results of PPI classification in the stage-specific interactomes are shown as histograms. For each interactome the percentage of D, SD and S PPIs is reported.

As shown in figure 21, the interactions classified as S are preponderant in the networks of early schizonts and gametocytes, whereas they represent 36% of total interactions in late schizonts. Interestingly, the trophozoite network contains only S interactions, indicating that no specific function is represented in lipid rafts of this stage. D interactions

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are more represented in late schizonts (about 20% of total interactions), while they slightly exceed 5% in early schizonts and gametocytes. *SD* interactions imply that a “static” protein is connected with “dynamic” partners, suggesting that a conserved protein may be implicated in different processes depending on parasite developmental stage.

Taken together *SD* and *D* interactions, completely absent in the trophozoite network, represent about the 31% and 18% of the early schizonts and gametocyte networks respectively, and more than 60% in late schizonts. Thus, it appears that late schizont interactome, with a higher number of interactions established between stage-specific proteins, is more “dynamic” than the other stages considered. This can reflect the fact that late schizonts contain fully developed, highly specialized invasive forms (merozoites) characterized by specific organelles, necessary to establish contact and penetrate inside the host erythrocyte. In the following paragraphs, we integrated S, SD and D classification with functional and topological information.

4.6.b Cluster analysis.

In principle, proteins with functional relationships are highly connected and form distinct clusters in a PPI network.

Here we applied the AllegroMCODE software (Bader, et al, 2003) to identify clusters within each stage-specific *P. falciparum* network and assigned a functional annotation to the proteins populating each cluster. Examples of

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clusters enriched in specific functional categories are presented in figure 22 where networks are represented as graphs and larger nodes indicate “dynamic” components.

The invasion-related proteins (green dots in figure 22) poorly populate the

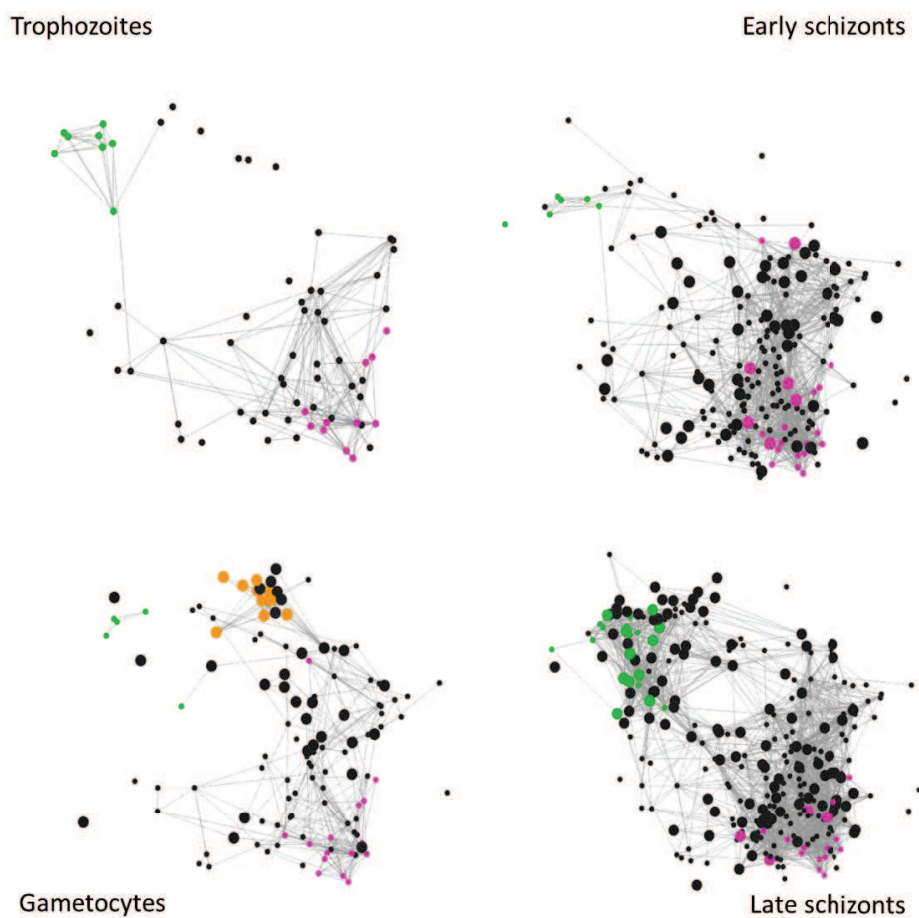


Figure 22. *P. falciparum* lipid-raft PPI networks. The stage-specific interactomes of lipid rafts are shown as graphs, where nodes represent proteins and edges their connections. Green nodes represent proteins annotated as “invasion related”, while pink and orange nodes represent proteins involved in folding and egress/fertilization processes, respectively. Larger nodes correspond to proteins classified as “dynamic”.

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interactomes of trophozoites and early schizonts, while they form a large cluster in late schizonts. Further, proteins involved in early steps of gametogenesis (orange dots in figure 22), i.e. the egress and fertilization, form a distinct cluster in gametocyte network. Egress, is a process leading to the rupture of the erythrocyte membrane to enable gamete release and the successive fusion of female and male gametes (fertilization). These processes occur in the mosquito midgut, following an infected blood meal, although several involved proteins are already expressed at the gametocyte stage. In figure 22, we also highlighted proteins involved in folding (pink nodes), a category represented with a variable abundance in stage-specific interactomes, likely reflecting the weight that raft-mediated folding has in the different developmental stages. Interestingly, in early and late schizonts members of this protein family are recruited in lipid rafts in a stage-specific manner (dynamic nodes), while in trophozoites and gametocytes all detected chaperonins are implicated in conserved pathways (static nodes).

These examples show that cluster analysis, combined with functional annotation of protein components may clarify a specific biological context. This information can be also exploited to assign a role to proteins of unknown functions, residing in the same cluster. An example is shown in figure 23 where proteins implicated in either egress or fertilization are connected with four unknown “dynamic” proteins residing in the same cluster of gametocyte interactome (orange and black nodes respectively). These proteins may represent new candidates involved in the egress process and place them as suitable targets for further investigation.

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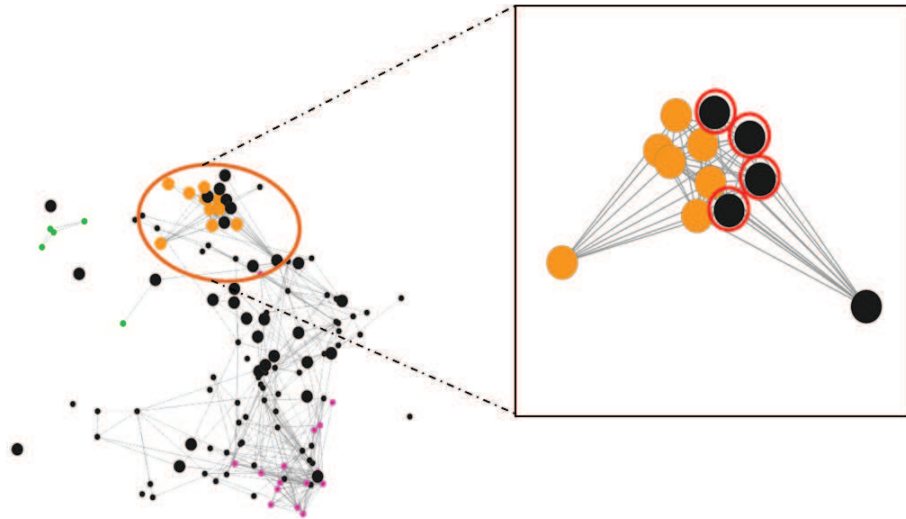


Figure 23. Egress/fertilization cluster in gametocyte interactome. A cluster of proteins involved in egress/fertilization (orange nodes) is highlighted in the gametocyte interactome (left panel). In the inset the four nodes rounded in red are proteins of unknown function.

4.6.c The lipid raft “functional core”.

As shown above, lipid raft interactomes include proteins conserved between networks, suggesting the presence of a common pattern of interactions maintained across all the various stages. To define this “functional core”, we decided to apply a network alignment to the four lipid raft networks (Wang & Gao, 2012; Bandyopadhyay, et al, 2006). We adopted the GASOLINE software (Micale, et al, 2014) that perform a multiple local alignment and evaluates its quality by measuring the average degree of conservation by an Index of Structural Conservation (ISC) ranging from 0 to 1.

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We identified a high quality alignment with a conserved topology across the four stages (ISC=1), composed of 24 nodes (figure 24). When we examined this subnetwork by a functional point of view (see Table V), we observed that several interacting partners localize to either the parasitophorous vacuole

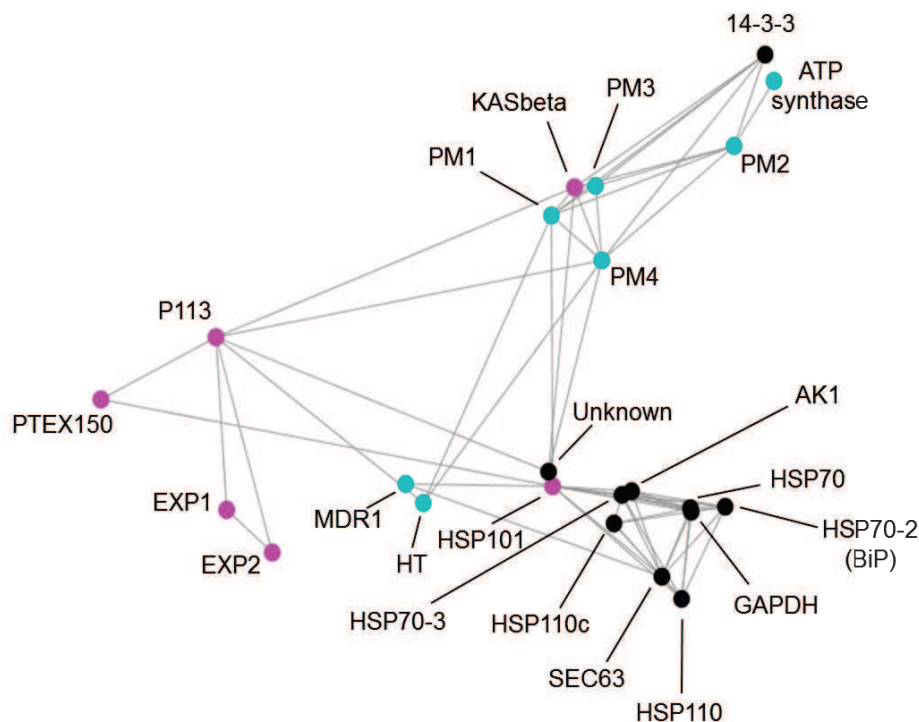


Figure 24. Lipid raft “functional core”. A sub-network topologically conserved across the four interactomes was revealed by aligning the stage-specific PPI networks. Pink nodes represent proteins localized to the PVM, while light blue nodes represent FV membrane proteins.

membrane (PVM) (pink nodes in figure 24), or the food vacuole membrane (FVM) (light blue nodes in figure 24), subcellular compartments involved in processes important for parasite development inside the host erythrocyte.

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The PVM that surrounds the parasite during the entire erythrocyte cycle is involved in protein sorting and trafficking to internal subcellular compartments or to the erythrocyte cytosol. Parasite proteins routed to the host cell compartment cross the PVM using a translocation machinery, also known as PTEX complex (de Koning-Ward, et al, 2009). Several subunits of the PTEX reside in the “functional core” subnetwork and are shown to interact between each other. The “functional core” subnetwork also includes numerous members of the heat shock protein family. These class of proteins have been demonstrated to be crucial under fever attacks in guaranteeing the correct protein folding (Pavithra, et al, 2004), but they are also enriched in the PVM (Nyalwidhe & Lingelbach, 2006) where they likely guide unfolding and refolding of proteins trafficked between membrane compartments.

Table V: protein of the “functional core” with possible evidence of their cellular localization.

Protein ID	Product description	Localization & Reference	
MAL13P1.540	heat shock protein 110, putative (HSP110)		
MAL8P1.69	14-3-3 protein (14-3-3I)		
PF07_0033	heat shock protein 110 (HSP110c)		
PF08_0054	heat shock protein 70 (HSP70)		
PF10_0086	adenylate kinase (AK1)		
PF11_0175	heat shock protein 101, chaperone protein ClpB2 (HSP101)	PVM	de Koning-Ward, et al, 2009; Riglar, et al, 2012
PF11_0224	circumsporozoite-related antigen, exported protein 1 (EXP1)	PVM	Riglar, et al, 2012

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PF11_0351	heat shock protein 70 (HSP70-3)		
PF13_0102	translocation protein SEC63 (SEC63)		
PF14_0075	plasmepsin IV (PM4)	FV	Banerjee, et al, 2002
PF14_0076	plasmepsin I (PM1)	FV	Banerjee, et al, 2002
PF14_0077	plasmepsin II (PM1)	FV	Banerjee, et al, 2002
PF14_0078	plasmepsin III, histo-aspartic protease (PM3)	FV	Banerjee, et al, 2002
PF14_0201	surface protein P113 (P113)	PVM	Obando-Martinez, et al, 2009
PF14_0344	translocon component PTEX150 (PTEX150)	PVM	de Koning-Ward, et al, 2009
PF14_0598	glyceraldehyde-3-phosphate dehydrogenase (GAPDH)		
PF14_0615	ATP synthase (C/AC39) subunit, putative	FV*	Lamarque, et al, 2008
PF14_0678	exported protein 2 (EXP2)	PVM	Fischer, et al, 1998; Ito, et al, 2011
PFB0210c	hexose transporter (HT)	FV*	Slavic, et al, 2010
PFE1150w	multidrug resistance protein (MDR1)	FV	Cowman, et al, 1991
PFE1195w	karyopherin beta (KASbeta)	PVM*	Mohammed, et al, 2005
PFI0875w	heat shock protein 70 (HSP70-2), BiP		
PFI1270w	conserved <i>Plasmodium</i> protein, unknown function		

*predicted

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Plasmepsins and the multi-drug resistance 1 (MDR1) (light blue nodes in figure 24) localize to the food vacuole membrane (FVM), where they are involved in the hemoglobin digestion. *Plasmodium* parasites engulf part of the host cytoplasm through the invagination of the PVM and the generated vesicles release their content in the food vacuole (FV) (Lazarus, et al, 2008) where the hemoglobin digestion starts by plasmepsins (Banerjee, et al, 2002). The membrane pump MDR1, is then involved in translocating small peptides derived from the digestion of the hemoglobin that represent one of the major amino acid sources for the parasite. About 60-80% of the host hemoglobin is digested during *Plasmodium* infection (Francis, et al, 1997), suggesting a constant trafficking of vesicles from the PVM to the FV and thus a sort of constant interaction between these compartments, that may be mediated by membrane microdomains. Consistent with the functional interaction of these membrane compartments is the interconnection of their components observed in the “functional core” subnetwork.

The inspection of the “functional core” subnetwork suggests other possible candidates that may populate the functional interface between the PVM and FV. One of them is the Hexose Transporter (HT; PFB0210c), whose subcellular localization has not been determined in *P. falciparum* blood stages. Interestingly, the rodent *P. berghei* orthologs has been localized at the food vacuole (Slavic, et al, 2010). Overall these results underline the sensitivity of our interactome in describing the functional interactions between proteins.

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5- CONCLUSIONS AND PERSPECTIVES

The reconstruction of the complex networks of functional and physical relationships between proteins is a central issue for the understanding of biological processes. For this reason, the prediction of interactomes is one of the most important challenges for both experimental and computational biologists. In the last ten years, a great amount of data has been produced by “high-throughput” approaches. The number of sequenced genomes, their quality in terms of completeness and the annotation of the gene repertoires significantly increased. In parallel, novel data sets have been acquired by transcriptomic approaches and mass spectrometry analyses on whole cell proteomes under specific conditions or at different developmental stages.

Computational methods to predict PPIs emerged in parallel with the first releases of completely sequenced genomes. The availability of this great amount of genomic data and the corresponding repertoires of predicted proteins made it possible to develop novel classes of predictive algorithms based on statistical methods.

In this work, we applied computational methods to obtain a new PPI network for the malaria parasite *P. falciparum*, with the aim to gain insights on the biological functions and PPIs taking place in membrane microdomains or lipid rafts. This subcellular compartment is involved in crucial cellular processes such as signal transduction, protein sorting and trafficking and membrane fusion events. Lipid raft characterization in *Plasmodium*-infected erythrocytes may provide new insights on parasite biology and potential candidates for drugs development.

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Taking advantage of the available genomic, transcriptomic and proteomic, data, we applied a Bayesian approach to predict a probabilistic global interactome of *P. falciparum* and used this information to derive PPI networks of lipid raft-associated proteins in four different stages of the parasite development.

To this aim, we performed a re-assessment of two computational approaches usually used to predict PPIs: the phylogenetic profiling and the construction of the rosetta stone data.

Thanks to the increasing amount of available genomic data, phylogenetic profiling is one of the most promising computational approaches to predict PPIs. It is based on the detection of co-evolving proteins, which are often involved in the same biological pathways or in the same complex. This method relies on the comparison of proteins from a given genome with those from genomes in a reference set.

The two crucial points of this method are the selection procedure to include genomes in the reference set and the choice of the metric to compare the phylogenetic profiles. Redundancies in the reference set as well as the quality of the genome sequences affect the predictive performances of the method. A fortiori, the metric adopted to compare phylogenetic profiles clearly influences the prediction of true PPIs. Several studies demonstrated that, correlation based metrics provide the best results in detecting pairs of interacting proteins (Glazko, et al, 2004). These metrics, however, capture only linear relationships between variables, while mutual information reveals both linear and not linear associations. Recently, Szekely and collaborators proposed a novel statistics as an extension of the Pearson's correlation coefficient (Szekely, et al, 2007). They showed that distance correlation is equal to zero, if and only if the two

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variables are independent, while it assumes positive values if any relationship exists between them.

We addressed the two issues regarding the reference set construction and the comparison of phylogenetic profiles, developing a new strategy of genome selection, based on the phylogenetic relationships between them, and applying the distance correlation as a novel measure of profile similarity. This results in an improvement of phylogenetic profiling in PPI prediction. Furthermore, we confirmed the influence of the reference set in terms of size and genome composition. Our strategy of genome selection allowed for the construction of an “outperforming” reference set, which was then used to derive the novel set of phylogenetic profiles for *P. falciparum*.

The same procedure was also adopted to construct the reference set (RS1) used to derive new data on rosetta stone proteins for *P. falciparum*. Although, the number of parasite proteins that we found to be encoded by fused genes in the reference set is comparable to those detected in previous studies, we obtained a strong improvement in the accuracy of the method.

Moreover, a further validation of the robustness of RS1, comes from an independent analysis of a potential “rosetta-stone protein” of the pathogen protozoan *G. duodenalis*. Database searches, using several portions of the protein *versus* RS1 suggested that a gene fusion event might be occurred in a bacterium followed by a gene-transfer event to the common ancestor of *G. duodenalis* and *E. histolytica*, that shared the ecological niches of the human intestine.

As interacting proteins are very often found to be encoded by co-expressed genes, in parallel with the construction of novel genomic data sets, we exploited

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available transcriptomic data to derive and compare new gene expression profiles covering both sexual and asexual stages.

Genomic and transcriptomic data were integrated and a global probability score was obtained for each predicted PPI. We showed that the predictive performance of this global score, strongly outperforms that obtained by the single scores. Then, we extracted a “high-accuracy” set of PPIs with a global score corresponding to a ratio of TP/FP higher than 10 and containing more than the 88% percent of *P. falciparum* proteins. The resulting PPI network includes all possible interactions irrespective of protein co-occurrences in terms of timing of expression or cellular localization. To overcome this problem, we filtered the PPI network with proteomic data on lipid rafts-associated proteins in four developmental stages of *P. falciparum*, obtained by the host lab. The functional and topological characteristics of the four stage-specific interactomes were explored using different methods. We observed that lipid raft PPI interactome undergoes to a continuous remodeling during the parasite development. We also observed that proteins involved in stage-specific processes, like invasion and egress, form distinct clusters. The fact that these clusters include proteins whose function is still unknown, can be exploited to predict their possible biological roles.

Furthermore, the alignment of the four PPI networks revealed a “functional core” of raft-associated proteins forming a subnetwork topologically conserved in the four PPI networks. This subnetwork is formed by proteins involved in two fundamental processes of the parasite cell: hemoglobin digestion and protein sorting/trafficking.

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This work represents an improvement in the quality and accuracy of PPI network prediction for *P. falciparum*, and opens new perspectives in the investigation of specific biological questions.

The possibility to filter the network using diverse proteomic data enables to include spatial and temporal information and gives the opportunity to analyze the dynamics of subcellular compartments during developmental phases or under different *stimuli*. This may suggest new drug/vaccine candidates to be submitted to experimental validation.

Furthermore, the genomic data sets that we produced may have other interesting applications. The comparative analysis of parasite and host proteins by phylogenetic profiling may provide insights on parasite-host interactions that play important role in several crucial processes, like sequestration of infected erythrocyte, host cell remodeling by the generation of novel membrane compartments, invasion and egress from the host cell (preliminary analyses are presented in Part III).

Furthermore, novel phylogenetic profiles and rosetta stone data may have a more general application to gain insights on gene evolution (an example is presented in Part III).

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PART II



The FAD-dependent glycerol-3-phosphate dehydrogenase of *Giardia duodenalis*: an unconventional enzyme that interacts with the g14-3-3 and it is a target of the antitumoral compound NDBHEX.

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1 **The FAD-dependent glycerol-3-phosphate dehydrogenase of *Giardia***
2 ***duodenalis*: an unconventional enzyme that interacts with the g14-3-3**
3 **and it is a target of the antitumoral compound NDBHEX**

4
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23
24 **Abstract**

25 The flagellated protozoan *Giardia duodenalis* is a worldwide parasite causing giardiasis, an acute and
26 chronic diarrheal disease. Metabolism in *G. duodenalis* has a limited complexity thus making
27 metabolic enzymes ideal targets for drug development. However, only few metabolic pathways (i.e.
28 carbohydrates) have been described so far. Recently, the parasite homolog of the mitochondrial-like
29 glycerol-3-phosphate dehydrogenase (gG3PD) has been identified among the interactors of the g14-3-3
30 protein. G3PD is involved in glycolysis, electron transport, glycerophospholipids metabolism and
31 hyperosmotic stress response, and is emerging as promising target in tumor treatment. In this work, we

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32 demonstrate that gG3PD is a functional flavoenzyme able to convert glycerol-3-phosphate into
33 dihydroxyacetone phosphate and that its activity and the intracellular glycerol level increase during
34 encystation. Taking advantage of co-immunoprecipitation assays and deletion mutants, we provide
35 evidence that gG3PD and g14-3-3 interact at the trophozoite stage, the intracellular localization of
36 gG3PD is stage dependent and it partially co-localizes with mitosomes during cyst development.
37 Finally, we demonstrate that the gG3PD activity is affected by the antitumoral compound 6-(7-nitro-
38 2,1,3-benzoxadiazol-4-ylthio)hexanol (NBDHEX), that results more effective *in vitro* at killing *G.*
39 *duodenalis* trophozoites than the reference drug metronidazole. Overall, our results highlight the
40 involvement of gG3PD in processes crucial for the parasite survival thus proposing this enzyme as
41 target for novel anti-giardial interventions.

42

43 **Running title:** The gG3PD of *Giardia duodenalis*.

44

45 **Keywords:** *Giardia duodenalis*, FAD-dependent glycerol-3-phosphate dehydrogenase, 14-3-3 protein,
46 energy metabolism, mitosome, encystation, NBDHEX, nitroreduction.

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48 **Introduction**

49 The flagellated protozoan *Giardia duodenalis* (syn. *lamblia, intestinalis*) is a parasite of the upper part
50 of small intestine of mammals, including humans. Infection with *G. duodenalis* causes giardiasis, one
51 of the most common foodborne and waterborne gastroenteric diseases (Ryan and Cacciò, 2013; Halliez
52 and Buret, 2013). The parasite has a simple two-stages life cycle consisting of the trophozoite, that
53 replicates and colonizes the host intestine causing symptoms, and the cyst, the environmentally
54 resistant stage that is spread with feces and is responsible for transmission of the infection. Generally,
55 infection is acquired by ingestion of cysts in contaminated water and food or by the fecal-oral route
56 (Ryan and Cacciò, 2013). Clinical symptoms of giardiasis can vary from asymptomatic infection to
57 acute and chronic diarrhea, ultimately leading to chronic post-infectious gastrointestinal complications,
58 including irritable bowel syndrome and chronic fatigue (Halliez and Buret, 2013). Up to date, no
59 human vaccine for giardiasis is available and treatment relies only on a limited panel of effective
60 approved drugs. Nitroheterocyclics, such as metronidazole (MTZ) and nitazoxanide (NTZ), are the
61 anti-giardial drugs of choice. Unfortunately, treatment failure has been reported in 10-20% of cases and
62 strains resistant to different compounds have been either clinically isolated or induced *in vitro* (Lalle,
63 2010; Watkins and Eckmann, 2014). In this scenario, alternative, safe and effective therapies are
64 required.

65 *G. duodenalis* has a peculiar energy metabolism. It is a microaerophilic organism that, instead of
66 mitochondria, contains mitosomes, highly reduced mitochondria-derived organelles which sole
67 function seems to be restricted to Fe-S cluster biosynthesis (Tovar et al., 2003; Jedelsky et al., 2011).
68 Energy is then generated by substrate level phosphorylation and fermentation occurring in the
69 cytoplasm or at the inner side of the plasma membrane (Adam, 2001). In terms of sequence similarity,
70 these metabolic pathways of *G. duodenalis* consist of a mixture of eukaryote-like and bacteria-like
71 enzymes. Therefore, energy and intermediate metabolism of *G. duodenalis* have been shown to provide
72 opportunities to identify novel and effective compounds, as well as potentially interesting targets by
73 means of high-throughput drug screening and target-based drug design (Müller and Hemphill, 2013;
74 Watkins and Eckmann, 2014).

75 We recently detected a putative glycerol-3-phosphate dehydrogenase/flavin-dependent oxidoreductase
76 (gG3PD, GL50803_16125) of *G. duodenalis* among proteins interacting with the parasite 14-3-3
77 isoform, g14-3-3 (Lalle et al., 2012). The 14-3-3s are a family of highly conserved eukaryotic
78 phosphoserine/phosphothreonine-binding proteins which participate to the regulation of key cellular
79 processes by direct interaction with hundreds of target proteins (Gardino and Yaffe, 2011; Kleppe et

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80 al., 2011). The characterized g14-3-3 interactome provides evidences that g14-3-3 can be involved in
81 parasite energy metabolism, as supported by the identification and confirmation of components of both
82 the glycolytic/gluconeogenetic pathway and pyruvate metabolism (Lalle et al., 2012).
83 Flavin adenine dinucleotide (FAD)-dependent glycerol-3-phosphate dehydrogenase (G3PD, EC
84 1.1.5.3) is a key enzyme at the crossroad of glycolysis, redox and fatty acid metabolism, in both
85 prokaryotes and eukaryotes. G3PD catalyzes the oxidation of glycerol-3-phosphate (G3P) to
86 dihydroxyacetone phosphate (DHAP) with simultaneous reduction of FAD to FADH₂ and transfer of
87 electrons to quinones (e.g. ubiquinone) (Uندن and Bongaerts, 1997; Mráček et al., 2013). In
88 eukaryotes, a single subunit enzyme (mG3PD, 69-75kDa) is strongly associated, as peripheral protein,
89 with the outer face of the inner mitochondrial membrane (Janssen et al., 2002; Mráček et al., 2013).
90 The mG3PD has multiple functions: i) it forms the glycerophosphate shuttle in combination with the
91 cytosolic NADH-dependent G3PD (cG3PD, EC 1.1.1.8) to re-oxidize the cytosolic NADH produced
92 by glycolysis; ii) it is part of the mitochondrial respiratory electron transport chain (ETC) channeling
93 electron to quinone pool and bypassing Complex I; iii) it regulates the cytosolic level of G3P (Bell and
94 Coleman, 1980; Mráček et al., 2013). Prokaryotes harbor two distinct membrane-associated FAD-
95 dependent G3PDs, both necessary for bacterial growth in presence of glycerol or G3P as sole carbon
96 source, and represent key primary dehydrogenases transferring reducing equivalents to a short
97 respiratory ETC with different terminal reductases and electron acceptor (O₂, nitrate or fumarate)
98 (Uندن and Bongaerts, 1997). The homodimeric GlpD is associated with the cytoplasmic side of
99 plasma membrane, shows 30-33% homology with eukaryotic mG3PD, and is expressed under aerobic
100 conditions when O₂ is the terminal acceptor (Waltz et al., 2002; Yeh et al., 2008). The heterotrimeric
101 GlpACB is induced under anaerobic conditions, with fumarate as terminal acceptor (Cole et al., 1988;
102 Varga and Weiner, 1995): it forms a functional-associated complex with fumarate reductase and
103 contributes to generate a proton gradient across the membrane via an associated ETC (Miki and
104 Wilson, 1978). The GlpAC heterodimer (62 and 41 kDa, respectively) is the soluble catalytic subunit,
105 containing the FAD and FMN binding sites (Cole et al., 1988). The GlpB (44 kDa) subunit, that
106 contains a ferredoxin-type (4Fe-4S) cluster binding motif, anchors the GlpAC dimer to the inner
107 cytoplasmic membrane and mediate the transfer of reducing equivalent to the menaquinone pool and
108 finally to the fumarate reductase (Varga and Weiner, 1995).
109 The G3PDs are also involved in pathogenicity as a source of reactive oxygen species (ROS). The
110 mG3PD has been implied in the establishment of a pro-oxidative environment that promotes the fast
111 growth of undifferentiated tumors (Chowdhury et al., 2007; Mráček et al., 2013), whereas the oxidase

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112 activity of GIpD of *Mycoplasma* spp. seems to be crucial for the pathogenicity, leading to high levels of
113 H₂O₂ and host cell damage (Großhennig et al., 2013).

114 In the present work, we investigated gG3PD expression, activity, and cellular localization in the *G.*
115 *duodenalis* trophozoite stage and during the encystation process. Moreover, we demonstrated that the
116 antitumoral compound (NBDHEX) is an effective anti-giardial compound that negatively affected
117 gG3PD activity. Overall, our results pointed out the role of gG3PD in biological processes crucial for
118 the parasite survival, thus suggesting that this enzyme could represent a good candidate for targeted
119 anti-giardial interventions.

120

121 **Materials and Methods**

122

123 **Chemicals.** The 6-(7-nitro-2,1,3-benzoxadiazol-4-ylthio)hexanol (NBDHEX) was synthesized as
124 previously described (Ricci et al., 2005). Metronidazole (MTZ), flavin adenine dinucleotide disodium
125 salt (FAD), sn-glycerol-3-phosphate (g3p), phenazine methosulfate (PMS), 3-(4,5-dimethylthiazol-2-
126 yl)-2,5-diphenyltetrazolium bromide (MTT) were from Sigma-Aldrich (St. Louis, Missouri, USA).

127

128 **Parasite cultivation, differentiation and transfection.** The *G. duodenalis* isolate WB clone C6 (WB-
129 C6) was axenically grown in TYI-S-33 medium at 37 °C and differentiation into cyst (encystation) was
130 induced in TYI-S-33 medium containing 5 mg/ml of bovine bile at pH 7.8 for the indicated time
131 (Schupp et al., 1988). Parasites were collected by chilling tubes on ice and centrifugation at 800 × *g*.
132 Transgenic lines were generated by trophozoite electroporation with 15 µg of plasmid DNA and
133 selected and maintained under constant selection with 100 µM puromycin (Invivogen, Toulouse,
134 France).

135

136 **Vector construction.** *Escherichia coli* BL21-DE3 competent cells were used. The full-length sequence
137 of gG3PD (accession number GL50803_16125), the gG3PD N-terminal (nucleotide 3-1590;
138 gG3PD_N) and the C-terminal half (nucleotide 1569-3333; gG3PD_C), were PCR amplified from the
139 *G. duodenalis* WB-C6 genomic DNA, prepared as previously described (Lalle et al., 2012). The
140 primers used and their combinations are reported in Table 1. Reactions were performed on a T-Personal
141 Thermocycler (Biometra, Göttingen, Germany) using 100 ng of gDNA, 10 units of high fidelity Pfu
142 turbo DNA polymerase (Agilent Technologies, Santa Clara, CA, USA), 50 µM dNTP, 20 pmols of
143 each primer in 50 µl of reaction mixture. Amplification conditions were: 1 cycle at 95 °C for 2 min; 30

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144 cycles at 95 °C for 30 sec, 58 °C for 30 sec and 72 °C for 30 sec; and 1 cycle at 72 °C for 7 min. PCR
145 fragments were cloned either in the *BamHI/PspOMI* digested pTUB-FLAG_HApac vector (Lalle et al.,
146 2012) for expression in *G. duodenalis*, or in the *BamHI/NotI* digested pQ30 vector (Qiagen, Germany)
147 for expression in bacteria as N-terminal 6xHIS-tagged fusion protein.

148

149 **Expression and purification of the recombinant proteins.** Transformed *E. coli* were grown in SOB
150 medium and recombinant proteins expression was induced at OD₆₀₀= 0.6, with 0.5 mM isopropyl-thio-
151 β-D-galactoside at 37°C for 4 h. All 6xHIS-fused proteins were purified under native condition by
152 affinity chromatography on nickel resin (Qiagen) and eluted with 250 mM imidazole (pH 8.0). Proteins
153 were dialyzed against PBS (140 mM NaCl, 2.7 mM KCl, 10 mM Na₂HPO₄, 1.8 mM KH₂PO₄, pH 7.4)
154 using Slide-A-Lyzer dialysis cassettes (cut-off 3.5 kDa, Thermo Fisher Scientific, Rockford, ILL,
155 USA). The protein concentration was determined by Bradford assay (Thermo Fisher Scientific) and
156 proteins were stored at -70°C until use.

157

158 **Production of Polyclonal Antibodies** Purified HIS-gG3PD fusion protein was used to immunize
159 intraperitoneally two BALB/c mice (Charles River Laboratories International, Inc., MA, USA) on days
160 0, 21, and 42 with 50 µg protein in 300 µl of emulsified 1:1 PBS/Freund's complete adjuvant (Sigma
161 Aldrich) (at day 0) or 1:1 PBS/Freund's incomplete adjuvant (Sigma Aldrich) (at day 21) or without
162 any adjuvant (at day 42). Blood was collected from the tail vein before initial immunization and after
163 each boost. Sera fractions were assayed for specific antibody content.

164

165 **Preparation of *G. duodenalis* proteins.** Total soluble proteins (S) and octyl β-D-glucopyranoside
166 solubilized proteins from membranous material (M) were prepared as previously described (Lalle et al.
167 2012) starting from 2x10⁹ trophozoites or encysting parasites. The protein concentration was
168 determined by Bradford methods (Thermo Fisher Scientific) and the protein lysates were stored at -70
169 °C. Alternatively, to assess the G3PD enzymatic activity in *G. duodenalis*, 10⁶ parasites were collected,
170 washed two times with cold PBS, suspended in 200 µl of PBS/1% TritonX100 and incubated 1 h on
171 ice. After centrifugation at 13.000 x g for 15 min, supernatant was collected, protein concentration
172 quantified by Bradford methods and the preparation was immediately used for the enzymatic assay as
173 detailed below.

174

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175 **Western blot analysis.** Proteins were separated on SDS-PAGE and transferred onto PVDF membrane
176 with 39 mM glycine, 48 mM Tris, 0.1% SDS, and 10% methanol, using a semidry apparatus (BioRad,
177 Hercules, CA, USA). Membranes were blocked with 5% skin milk in TTBS (20 mM Tris-HCl, pH 7.5,
178 100 mM NaCl, 0.05% Tween 20) for 1 h and then incubated with the primary antibody (Ab) in 2.5%
179 skin milk/TTBS buffer. After incubation with an appropriate HRP-conjugated secondary Ab (1:3000),
180 the interaction was revealed by chemiluminescence (Millipore, France). Antibodies were used at the
181 following dilution: mouse polyclonal anti-gG3PD antiserum 1:3000; mouse anti-HA mAb (Sigma-
182 Aldrich) 1:3000; rabbit N14 (anti-g14-3-3) antiserum (Lalle et al., 2006) 1:5000; mouse anti- α Tubulin
183 (Sigma-Aldrich) 1:10000; rabbit anti-gPGN (phosphoacetylglucosamine mutase, Lopez et al., 2003)
184 1:1000; mouse anti-HIS mAb (Qiagen) 1:2000.

185

186 **Blue Native PAGE (BN-PAGE).** 3–12% BN-PAGE (Invitrogen, Carlsbad, CA, USA) was carried out
187 using 1 μ g of purified HIS-tagged recombinant proteins according to the manufacturer. This technique
188 allows the separation of very high molecular weight multiprotein complexes. Gels were run in Running
189 buffer (0.002% Coomassie G-250, 50 mM BisTris/50 mM Tricine, pH 6.8) at 150 V for approximately
190 2 h. Gels were incubated in Tris/glycine/SDS buffer for 30 min and either stained with a Silver Staining
191 kit (Invitrogen) or processed for western blot as described.

192

193 **Affinity purification.** FLAG-tagged proteins were purified by affinity chromatography on mouse anti-
194 FLAG M2 mAb covalently bound to agarose beads (Sigma-Aldrich) as previously reported (Lalle et
195 al., 2012) and directly eluted from the resin by incubation with 200 μ M FLAG-peptide at 4 °C for 1 h.
196 The eluted materials were stored at -70 °C until use.

197

198 **Confocal Laser Scanning microscopy (CLSM).** Trophozoites or encysting parasites were fixed and
199 permeabilized as previously described (Lalle et al., 2006). Antibodies were used at the following
200 dilution: polyclonal rabbit N14 antiserum 1:50; mouse polyclonal anti-gG3PD antiserum 1:50;
201 polyclonal rabbit anti-gTom40 antiserum (Dagley et al., 2009) 1:50, FITC-conjugated mouse anti-HA
202 mAb (Miltenyi Biotec, Germany) 1:50; Cy5-conjugated anti-CWP mAb (Waterborne Inc., New
203 Orleans, LA, USA) 1:30. Alexa-Fluor 647- and 488-conjugated anti-rabbit and anti-mouse secondary
204 Ab (Invitrogen) were used at a 1:500 dilution. After parasite staining, coverslips were extensively
205 rinsed and then mounted using Vectashield[®] mounting medium (Vector Laboratories Inc., Burlingame,
206 CA, USA) containing 300 nM of 4',6-diamidino-2-phenylindole (DAPI). CLSM observations were

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207 performed on a Leica TCS SP2 AOBS (Leica Microsystems, Germany) apparatus, using excitation
208 spectral laser lines at 405, 488 and 647nm and selecting emission wavelengths by a proper setting of
209 the spectral detection system. Signals from different fluorescent probes were taken in sequential scan
210 mode. Image acquisition and processing were conducted by using the Leica Confocal Software (Leica
211 Microsystems). Image deconvolution was performed using the Huygens software (Scientific Volume
212 Imaging BV, Hilversum, The Netherlands).

213

214 ***G3PD enzymatic assay, spectrophotometric and fluorimetric analysis.*** The dehydrogenase activity of
215 gG3PD was assayed spectrophotometrically according to Kistler and Lin (1972) measuring the rate of
216 phenazine methosulfate (PMS)-mediated reduction of the tetrazolium dye, MTT, to its formazan by
217 addition of g3p. Reactions were performed in 96 well plate using either 100 μg of *G. duodenalis* Triton
218 X-100 protein lysate or 16 pmol of purified recombinant HIS-tagged proteins in a final volume of 200
219 μl containing 67 mM of potassium phosphate (pH 7.5), 0.2% Triton X100, 6.6 μg of MTT, 20 μg of
220 PMS, and 17 mM of g3p with or without 10 μM FAD. The g3p was omitted in the blank. Since crude
221 extracts could contain substantial endogenous substrates, to ensure a linear rate of MTT reduction,
222 reactions were pre-incubated at 25 $^{\circ}\text{C}$ for 5 min prior to the addition of MTT and g3p. Plates were
223 sealed with an air-tight adhesive tape (Greiner Bio One, Austria) to prevent evaporation. After blank
224 subtraction, the enzyme activity was calculated and expressed as micromoles per minute per milligram
225 of protein, considering that the extinction coefficient of reduced MTT is $17 \text{ mM}^{-1} \text{ cm}^{-1}$ at 570 nm. UV-
226 visible spectra of HIS-gG3PD (10 $\mu\text{g}/\mu\text{l}$) in 67 mM of potassium phosphate (pH 7.5), were recorded at
227 25 $^{\circ}\text{C}$ in 10 μl quartz capillaries. UV-visible spectra of 100 μM NBDHEX were recorded in 67 mM of
228 potassium phosphate (pH 7.5), 17 mM of g3p, with or without HIS-gG3PD (42 pmol) in 0.5 ml quartz
229 cuvette. All measures were done at 25 $^{\circ}\text{C}$ in a Multiskan Spectrum (Thermo) spectrophotometer.
230 Fluorescent spectra (excitation at 430 nm) were acquired in a Luminescence Spectrometer LS50B
231 (Perkin Elmer, Waltham, MA, USA).

232

233 ***Determination of intracellular glycerol.*** For the assay, 10^6 parasites were collected as previously
234 described, suspended in 100 μl of PBS, incubated 10 min at 95 $^{\circ}\text{C}$ and the supernatant collected after
235 centrifugation at 12,000 x g for 1 min. Protein concentration was measured by Bradford assay.
236 Intracellular glycerol level was enzymatically determined using the Free Glycerol Reagent kit (Sigma-
237 Aldrich) by measuring spectrophotometrically the production of a quinoneine dye at 540 nm. Assay
238 was performed on 96 well-plate according to the manufacturer's instruction, using 40 μl of parasite

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239 lysate and 160 μ l of enzyme mixture per well. After 5 min of incubation at 37 °C, absorbance was read
240 by Multiskan Spectrum (Thermo Scientific) spectrophotometer. Intracellular glycerol concentration
241 was calculated interpolating the obtained absorbance with a glycerol standard curve and expressed as
242 pmol of glycerol/ μ g of total protein. Each condition was assayed in triplicate and the experiment was
243 performed independently three times.

244

245 ***In vitro drug susceptibility assay.*** The *in vitro* assays were performed according to Bénéreé et al. (2007)
246 and Hounkong et al. (2011) with modifications. All compounds were dissolved and serially diluted in
247 1:1vol ethanol/DMSO. *G. duodenalis* trophozoites (5×10^5 parasite/ml) were cultured in 96-well plates
248 (Nunc Δ surface, Thermo Scientific) in TYIS-33 medium and 3 μ l of 100X concentrated compound, or
249 solvent, were added to reach the desired compound concentration. The plates were sealed with an air-
250 tight adhesive tape (Greiner Bio-One GmbH, Austria) and incubated for 48h at 37°C. After the
251 incubation period, culture medium was removed. Adherent trophozoites were immediately fixed with
252 300 μ l of methanol for 2 min and then stained with a solution of 0.1% methylene blue in PBS for 10
253 min at RT. Wells were washed 3 times with PBS and incubated with 200 μ l of ethanol and 0.1 M HCl
254 (1:1 (v/v) in H₂O), to elute the dye. Absorbance was determined at 655 nm by Multiskan Spectrum
255 (Thermo Scientific) microplate spectrophotometer. Growth inhibition was calculated as the percentage
256 of treated parasite in comparison with untreated parasite. Three independent experiments were
257 performed and each drug dilution was assayed in triplicate. Alternatively, for drug efficacy tests with
258 resazurin (Bénéreé et al. 2007), trophozoites were grown in the presence of serial dilutions of the drugs,
259 or DMSO as control, in an anaerobic growth chamber (100 % N₂, 37°C). After 72 h, the medium was
260 removed, the wells were washed three times with pre-warmed PBS containing 1% of glucose (0.2 ml
261 per well), and finally, 0,2 ml PBS with glucose containing 10 mg/l resazurin were added. Reduced
262 resazurin was quantified by fluorimetry (excitation at 365 nm, emission at 455 nm) using a 96-well-
263 multimode plate reader Enspire (Perkin-Elmer).

264 For immunolocalization and enzymatic assays, drug treatments were performed in 10 ml screw cap
265 tubes using 1×10^5 parasite/ml of *G. duodenalis* trophozoites. Twenty five μ l of 20 mM NBDHEX in
266 ethanol, or the equal volume of ethanol, was added to 10ml of TYS-I-33 medium (final concentration
267 50 μ M) and parasites were incubated at 37°C for the indicated time periods and cells were processed as
268 described in previous paragraphs.

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270 **Mass spectrometry analysis.** Proteins were separated on a 1D-gel NuPAGE 4-12% (Novex, Invitrogen)
271 run in morpholinepropanesulfonic acid (MOPS) buffer and stained with the Colloidal Blue Staining
272 kit (Invitrogen). Slices were excised and digested with modified sequencing-grade trypsin (Promega
273 Corporation, France), as previously described (Shevchenko et al., 1996). Nanoflow reversed-phase
274 liquid chromatography tandem mass spectrometry (RP-LC-MS/MS) analysis of peptide mixtures was
275 performed using an HPLC Ultimate 3000 (DIONEX, Sunnyvale, CA U.S.A) coupled with a linear ion
276 trap (LTQ, Thermo Electron, San Jose, CA) mass spectrometer. Peptides were desalted in a trap
277 column (Acclaim PepMap 100 C18, LC Packings, DIONEX) and separated in the analytical column, a
278 10 cm long fused silica capillary (Silica Tips FS 360-75-8, New Objective) in house slurry-packed with
279 a 5 μm , 200 \AA pore size C18 resin (Michrom BioResources, CA). Peptides were eluted using a 40 min
280 linear gradient from 96% aqueous buffer containing 5% acetonitrile and 0.1% formic acid to 60%
281 organic buffer constituted by acetonitrile with 5% H_2O and 0.1% formic acid, at 300 nL/min flow rate.
282 Analyses were performed in positive ion mode and the HV Potential was set up around 1.7-1.8kV.
283 Tandem mass spectra were matched against the *G. duodenalis* protein database (Giardia DB version
284 1.2) downloaded from the Web site <http://www.giardadb.org/giardadb> and through the SEQUEST
285 algorithm incorporated in the Bioworks software (version 3.3, Thermo Electron). The following match
286 parameters were considered: fully tryptic cleavage constraints (one miscleavage allowed), static
287 cysteine carbamidomethylation, variable methionine oxidation. Precursor and fragment ions were
288 searched with 1.5 and 1 Da tolerance, respectively. Possible NBDHEX adducts on cysteine or lysine
289 residues were searched. The mass increments considered were +296, +281, +265 Da, for the intact,
290 partially or completely nitro-reduced NBDHEX adducts, respectively. Statistical parameters used for
291 legitimate protein identification were described elsewhere (Lalle et al., 2012).

292

293 **Chemical reduction of NBDHEX.** Sodium dithionite was prepared as a 1M solution in dd H_2O and was
294 used 100 mM to chemically reduce 10 mM NBDHEX in 20 μl 0.5% NH_3 . After 5 min, 2 μl reaction
295 was diluted to 200 μl in 67 mM potassium phosphate buffer (pH 7.5). NBDHEX fluorescence
296 quenching was verified at 25°C in a Luminescence Spectrometer LS50B (Perkin Elmer) whereas the
297 UV-visible spectra was acquired at 25°C in a Multiskan Spectrum (Thermo Scientific)
298 spectrophotometer in 0.5 ml quartz cuvettes. For the mass spectrometry analysis, the reaction mixture
299 was diluted in 50% ethanol and 1% ammonia and directly infused in the LTQ mass spectrometer
300 through a glass tip. The nanospray ionization in positive ion mode was allowed applying 1.5-1.6kV.

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301 HV Potential. Full MS in the 150-350 m/z range were acquired; then MS3 fragmentation of the ions
302 280 and 250, derived from MS2 of 298 and 268, respectively, was induced.

303

304 **Sequence analysis.** Conserved functional domains and sites in the protein sequence were search using
305 ELM (Dinkel et al., 2014) and BLASTP (<http://blast.ncbi.nlm.nih.gov>) algorithms. Transmembrane
306 regions were search by TMHMM Server v.2.0 (<http://www.cbs.dtu.dk/services/TMHMM/>).
307 Mitochondrial targeting signal were search using Psort II (<http://psort.hgc.jp/form2.html>) and MitoProt
308 II (<http://ihg.gsf.de/ihg/mitoprot.html>). Genomic sequences of 1133 organisms were downloaded from
309 EggNog database v.3.0 (Powell et al., 2012). If more than one strain was available, only the strain
310 classified as "core" was retained. This selection resulted in 774 organisms, which were included in the
311 reference set. The Smith-Waterman algorithm available in the FASTA package (Pearson and Lipman,
312 1988) was exploited using as query the gG3PD full-length sequence, or the protein portions
313 encompassing: the first 500 residues (referred as N-terminal domain); or the residues 501-950 (referred
314 as central domain); or the residues 951-1111 (referred as the C-terminal domain); or the protein portion
315 including the N- and central domains (residues 1-950). Sequences having a match result with E-value
316 lower than 10^{-6} were selected, except for the C-terminal domain for which the E-value threshold was set
317 at 10^{-3} . Sequence analysis, editing and phylogenetic analysis were performed using Bioedit (Hall T.A.,
318 1999), MEGA 5.0 (Tamura et al., 2013) and Jalview 2.8.2 (Waterhouse et al., 2009).

319

320 **Statistics.** Statistical analyses were performed with PRISM 6.0 software (GraphPad Software, Inc; La
321 Jolla, CA, USA) and significance was calculated by Student unpaired t-test and one-way ANOVA. A
322 P-value <0.05 was considered statistically relevant.

323

324 **Results**

325

326 **Sequence analysis of the putative FAD-dependent glycerol-3-phosphate dehydrogenase (gG3PD) of**
327 ***G. duodenalis* reveals an unusual protein organization.** The GL50803_16125 entry encodes a protein
328 of 1111 amino acids (approximately 119 kDa) annotated as FAD-dependent oxidoreductase/glycerol-3-
329 phosphate dehydrogenase, that we named gG3PD. A combined search for conserved regions in the
330 gG3PD protein sequence retrieved three principal domains (Supplemental Figure 1A). The region
331 encompassing residues 31-510 contains the multidomain TIGR03377 corresponding to the protein
332 family of the subunit A (GlpA) of anaerobic GlpACB. A second domain, residues 587-910,

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333 corresponds to a small NADH binding domain within a larger FAD binding domain (Pyr_redox_2,
334 PF07992) which is common to flavoproteins of the pyridine nucleotide-disulphide oxidoreductases
335 family (e.g. thioredoxin reductases, NADH oxidases and peroxidases). The last domain (DUF 1667),
336 encompassing residues 1039-1103, was previously found in archaeal and bacterial hypothetical
337 proteins, some of which are annotated as being potential metal-binding proteins. As for other G3PDs,
338 no transmembrane (TM) regions could be detected. Due to its unusual domain organization, the full-
339 length or three portions (residues 1-510, 511-950 and 951-111) of the gG3PD protein sequence were
340 used as query against a large non-redundant set of high quality reference genomes obtained from
341 EggNog. Despite an homologous sequence present in the genome of the closely related diplomonad
342 *Spironucleus salmonicida*, only protozoan parasites of the genus *Entamoeba* encode for a single
343 sequence orthologous to the full length gG3PD and also annotated as glycerol-3-phosphate
344 dehydrogenase. One orthologue of the first two portions of the gG3PD was found in the genomes of
345 *Eggerthella* spp., a non-sporulating medically important anaerobic Gram-positive bacillus, and
346 annotated as FAD-dependent oxidoreductase. On the contrary several hundred orthologues of the first
347 portion of gG3PD (residues 1-510), all annotated as glycerol-3-phosphate-dehydrogenases, were found
348 in the genome of human and animal pathogenic bacteria, such as *Trepomena* spp. (Spirochaetes) and
349 *Clostridium* spp. (Firmicutes), or to halophilic archaea, e.g. *Halorhabdus utahensis*, (Supplemental
350 Figure 1B). More than one hundred orthologues of the second portion (residues 501-950) were found in
351 human and animal pathogenic bacteria, but also in soil and plant bacteria (data not shown). Although
352 several of these proteins were annotated as oxidoreductases it was not possible to define, in terms of
353 substrate or biochemical pathway, any specific enzymatic function. Finally, only 33 orthologues were
354 found respect to the third portion of gG3PD (residues 951-111), which putative function could be that
355 of metal-binding proteins.

356

357 ***The intracellular localization and stage expression of gG3PD protein.*** According to the data reported
358 in GiardiaDB, the expression level of the *gg3pd* is downregulated during encystation. To investigate
359 whether the gG3PD protein expression level was similarly regulated we used a mouse polyclonal
360 antibody raised against a full-length HIS-tagged recombinant gG3PD expressed in bacteria. As shown
361 in Figure 1A, a band of approximately 120 kDa was immunodecorated with comparable intensity by
362 the anti-gG3PD Ab, both in cellular lysates from trophozoites and from parasites harvested at different
363 time points after encystation induction (at 6h, 12h and 24h). Encystation progress was checked by
364 immunostaining with anti-phosphoacetylglucosamine mutase (gPGN) Ab, a protein induced during

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365 cyst formation (Lopez et al., 2003). The anti-gG3PD Ab was also used to study the intracellular
366 localization of the protein by confocal laser scanning microscopy (CLSM). In the trophozoite (Figure
367 1B, panel a) the anti-gG3PD strongly stained the plasma membrane of the parasite ventral surface
368 likely corresponding to the marginal groove and ventrolateral flanges (VLF), fingerlike projections of
369 the plasma membrane involved in parasite attachment to the surface and to the host cell (Sousa et al.,
370 2001). As previously reported, the g14-3-3 showed a spotty broad distribution in the parasite cell body,
371 excluding the nuclei and the median body (smile-like microtubule aggregate in the middle of parasite
372 body). The widespread g14-3-3 staining makes it difficult to claim for a discrete co-localization with
373 the gG3PD, although a slight co-localization signal (pseudo color yellow) was visible at the posterior
374 edge of the trophozoite (Figure 1B, panel a, merge). *G. duodenalis* encystation was monitored by the
375 progressive appearance of specialized structures for the secretion of the cyst wall proteins, the
376 encysting specific vesicles (ESVs), which were stained, together with the cyst wall, by the anti-cyst
377 wall protein (CWP) mAb. In encysting parasites, in addition to the ventral plasma membrane, the anti-
378 gG3PD Ab (Figure 1B, panel b and c) labeled several structures, similar to aggregates/small vesicles, in
379 the cytoplasm. These structures did not co-localize with the ESVs and no straightforward co-
380 localization with g14-3-3 could be detected (Figure 1B, panel b and c). In cysts, the gG3PD was
381 diffused in the cytoplasm, although a marked aggregation close to the plasma membrane, below the
382 cyst wall was evident (Figure 1B, panel d). A faint co-localization with g14-3-3 (pseudo color yellow)
383 was detected below the cyst wall.

384 Since the staining with the anti-gG3PD Ab observed in encysting parasites resembled that of
385 mitochondria, additional co-localization experiments were performed using an antibody directed against
386 the mitochondrial marker Tom40 (Dagley et al., 2009). As shown in Figure 1C, both in trophozoites and
387 encysting parasites (panel a and b), the anti-Tom40 Ab stained the main central mitochondrion between the
388 nuclei and several peripheral smaller mitochondria. In trophozoites no co-localization with anti-gG3PD
389 could be detected (Figure 1C, panel a), whereas in encysting parasites superimposable signals (pseudo
390 color yellow) were evident in some of the peripheral mitochondria, and to a lesser extent in the central
391 one (Figure 1C, panel b), suggesting a partial re-localization of the protein to mitochondria.

392

393 **Interaction between gG3PD and g14-3-3** To further characterize the gG3PD, a N-terminally FLAG-
394 HA tagged gG3PD was expressed in *G. duodenalis* under the α -tubulin constitutive promoter. The
395 FLAG-HA-gG3PD was expressed at the same level, and comparable to the endogenous protein, both in
396 trophozoites and during the encystation stage (Figure 2A) and the intracellular localization largely

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397 resembled that of the endogenous gG3PD (Supplemental Figure S2). By following protein fractionation
398 (soluble and membrane fractions), the endogenous and the FLAG-HA-gG3PD were mainly detected in
399 the soluble fraction at both stages (Figure 2B). Whereas, a small protein amount could be detected in
400 the membrane fraction only at the trophozoite stage (Figure 2B), partially in agreement with
401 immunolocalization observations, suggesting that the gG3PD could form strong interactions with the
402 membrane or with membrane proteins. To better investigate the previously suggested interaction
403 between g14-3-3 and gG3PD (Lalle et al., 2012), immunoprecipitation experiments were performed.
404 As shown by anti-HA immunoblotting (Figure 2C, upper panel), the anti-FLAG mAb
405 immunoprecipitated the FLAG-HA-gG3PD only from transfected parasite extracts. Despite FLAG-
406 HA-gG3PD was comparably immunoprecipitated from both trophozoites and encysting parasites, g14-
407 3-3 was mainly co-immunoprecipitated from trophozoites, whereas only a faint signal was observed in
408 the immunoprecipitate from encysting parasites (Figure 2C, lower panel).

409 To shed light on the relevance of the two principal domains characterizing the gG3PD protein, two
410 deletion mutants were constructed and independently expressed in *G. duodenalis* as FLAG-HA-tagged
411 proteins. The FLAG-HA-gG3PD_N corresponds to N-terminal half of the protein (Supplemental
412 Figure S1A) and contains the FAD-dependent anaerobic glycerol-3-phosphate dehydrogenase-like
413 domain (residues 2-530); whereas the FLAG-HA-gG3PD_C corresponds to the C-terminal half and
414 contains the FAD-dependent pyridine nucleotide-disulphide oxidoreductase-like domain (residues 524-
415 1111). As shown by immunoblot (Figure 3A, upper and middle panels), the expression of both FLAG-
416 HA-tagged proteins was detected at both stages. In all transfection experiments, the expression of
417 deletion mutants was lower than that of the full-length FLAG-HA-gG3PD.

418 Intracellular localization of both mutants was performed with anti-HA antibody. CLSM analyses
419 (Figure 3B, panels a and b) showed that, in trophozoites and encysting parasites, the FLAG-HA-
420 gG3PD_N partially localized to the ventral plasma membrane and ventrolateral flanges, like the
421 endogenous gG3PD. Although a spotty cytoplasmic and an intense nuclear/perinuclear staining were
422 evident, in contrast with the endogenous and the full-length FLAG-HA-gG3PD, suggesting that a
423 fraction of the deleted protein could be misfolded and/or mislocalized. In FLAG-HA-gG3PD_C
424 transgenic parasites the protein was completely mislocalized and appeared widespread distributed, also
425 inside nuclei, with the nuclear/perinuclear localization even more evident in encysting parasites (Figure
426 4B, panel d and e). No mitosome-like staining was observed in encysting parasites for any of the
427 mutants (Figure 3B, panels b and e). Few cysts with a spotty cytoplasmic localization of the protein
428 were observed in both transgenic strains (Figure 3B, panels c and f). These observations likely suggest,

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429 that the N-terminal half of the protein contains the structural/sequence determiners necessary to
430 localize the gG3PD at the ventral plasma membrane and ventrolateral flanges. Looking for the
431 domain(s) involved in the interaction with g14-3-3, co-immunoprecipitation with anti-FLAG was also
432 performed using the FLAG-HA deletion mutants. Despite several attempts no conclusive results were
433 obtained (data not shown), likely due to the low expression of these proteins or to the presence of other
434 factors that could affect the interaction (e.g. partial misfolding, incomplete phosphorylation).

435

436 **Evaluation of gG3PD enzymatic activity.** To better define the role of gG3PD during *G. duodenalis*
437 differentiation, we first characterized the protein activity using N-terminally HIS-tagged versions of
438 both full-length gG3PD and deletion mutants heterologously expressed in *E. coli*. All recombinants
439 were expressed as soluble proteins and could be purified (up to 95%) under native conditions
440 (Supplemental Figure S3). The purified full-length HIS-gG3PD, but not the deletion mutants, showed a
441 distinctive yellow color (data not shown), compatible with the presence of a flavin cofactor. Indeed, the
442 UV-visible spectra of the HIS-gG3PD showed two absorbance peaks with a maximum approximately
443 at 350 and 440 nm (Figure 4A), very close to those of free flavin (either FAD or FMN or both),
444 supporting that the gG3PD is a flavoprotein. No similar peaks could be observed in the spectra of any
445 deletion mutants (data not shown). Since mG3PD/glpD are homodimeric proteins (Mráček et al.,
446 2013), the dimeric nature of gG3PD was assayed using native PAGE. As shown in Figure 4B, the HIS-
447 gG3PD_N was exclusively monomeric (60 kDa); whereas the HIS-gG3PD migrated in the gel both as a
448 120 kDa monomer and as a 240 kDa dimer, as confirmed by immunoblot assay with anti-HIS.

449 Similarly, the HIS-gG3PD_C migrated as a monomer around 60 kDa, and as a dimer of 120 kDa, thus
450 suggesting that at least one function of the gG3PD C-terminal half is to mediate protein dimerization.
451 The FAD-glycerol-3-phosphate dehydrogenase activity of the HIS-gG3PD was then assayed by
452 measuring the g3p-dependent reduction of MTT in presence of PMS, which mediates the transfer of
453 reducing equivalent from the enzyme to the terminal dye (Kistler and Lin, 1972). As shown in Figure
454 4C, the HIS-gG3PD displayed a specific activity corresponding to 86.7 ± 5.6 nmol/min/mg in the
455 absence of exogenous FAD, that did not significantly increase (89.8 ± 0.7 nmol/min/mg) even when
456 10 μ M FAD was added. Moreover, no activity could be observed either in the absence of g3p or PMS
457 (data not shown), thus proving that g3p is indeed the substrate of the enzyme and that an electron
458 carrier molecule, such as PMS, is required to reduce MTT. This is in agreement with the role of
459 quinone described for other FAD-dependent G3PDs (Uden and Bongaerts, 1997; Mráček et al., 2013).
460 Intriguingly (Figure 4C), the HIS-gG3PD_N, containing the GlpA-like domain, also displayed a basal

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461 enzymatic activity (30.5 ± 1.0 nmol/min/mg), 2.8-fold lower in comparison with the full length protein,
462 and it showed an increase of 17% in the activity (36.7 ± 3.0 nmol/min/mg) after stimulation with
463 exogenous FAD. On the contrary, the HIS-gG3PD_C did not show any enzymatic activity in any
464 condition (data not shown). These results support the homology data and confirm that the glycerol-3-
465 phosphate dehydrogenase activity is localized to the N-terminal half of the gG3PD.

466 To study the possible correlation between encystation-dependent intracellular re-localization of gG3PD
467 and its function, the enzyme activity was measured in trophozoites and encysting parasites extracts.
468 Indeed, compared to trophozoites, the gG3PD activity showed a 20% increase at 6h of encystation
469 (Figure 4D), then it was reduced nearly down to the trophozoite level after 12h of encystation. No
470 variation in the expression level of the gG3PD protein could be observed at any time points (Figure
471 4E). The encystation process in *G. duodenalis* has been proposed as a primitive response to cellular
472 stress (Argüello-Garcia et al., 2009). In unicellular organisms, as response to stress signals, the
473 intracellular level of glycerol increases, as consequence of a massive conversion of DAPH to g3p, due
474 to the greater activity of the NADPH-dependent G3PDs and in some cases also to that of FAD-
475 dependent G3PDs (Yang et al., 2007). To test this hypothesis we measured the intracellular content of
476 glycerol during encystation. The amount of glycerol increased up to 60% already at 6h post-encystation
477 induction (Figure 4F) and then of an additional 15% in 12h encysting parasites, thus suggesting a
478 possible relationship between the enhanced gG3PD activity and the glycerol accumulation occurring
479 during parasite differentiation.

480

481 ***In vivo effects of NBDHEX on G. duodenalis survival and gG3PD activity.*** Recently, a 7-nitro
482 benzoxadiazole (NBD) derivative has been shown to impair the growth of PC-3 adenocarcinoma cell
483 line by a significant inhibition of the glycerol-3-phosphate oxidoreductase activity of mG3PD (Singh,
484 2014). We wondered whether this class of molecules could be effective against *G. duodenalis*
485 trophozoites and the gG3PD. We selected the 6-(7-nitro-2,1,3-benzoxadiazol-4-ylthio)hexanol
486 (NBDHEX), a promising antitumoral drug acting as a suicide inhibitor of human glutathione S-
487 transferases (GSTs), that also shows a good tolerance in mouse models (Ricci et al., 2005; Turella et
488 al., 2005; Pellizzari Tregno et al., 2009; Tentori et al., 2011). NBDHEX cytotoxicity against *G.*
489 *duodenalis* trophozoites was evaluated *in vitro* after 48h of treatment in microaerophilic growth
490 conditions, using a colorimetric assay. As shown (Figure 5A), NBDHEX was effective against the
491 parasite (IC_{50} : 0.3 ± 0.1 μ M) at a lower concentration (5.6-fold) than that of the reference drug MTZ
492 (IC_{50} : 1.5 ± 0.1 μ M). Moreover, under anaerobic growth conditions NBDHEX was also more effective

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493 than MTZ (IC_{50} : $0.6 \pm 0.4 \mu\text{M}$ for NBDHEX and IC_{50} : $1.9 \pm 0.2 \mu\text{M}$ for MTZ) (data not shown). To
494 maximize in a short time period the possible NBDHEX effects, taking into account the parasite
495 intracellular environment, trophozoites were treated *in vivo* with $50 \mu\text{M}$ NBDHEX and then the gG3PD
496 enzymatic activity was assayed in parasite extracts. A 50% decrease of the gG3PD activity was already
497 evident after 2h of treatment (Figure 5B, $P < 0.01$), and a further 5% decrease was achieved after 4h and
498 6h. This suggests that *in vivo* NBDHEX treatment reduces the gG3PD activity, without inducing any
499 statistically relevant variation of the protein expression level (Figure 5C and D).

500

501 **Interaction of NBDHEX with gG3PD.** To ascertain if the effects on the gG3PD activity were due to a
502 direct NBDHEX binding to the enzyme, co-localization experiments were performed by CLSM (Figure
503 6A), taking advantage of the fluorescent properties of the compound (maximum emission peak at 525
504 nm) (Ricci et al., 2005). Only trophozoites treated with NBDHEX showed a spotted faint fluorescence
505 in the cytoplasm. A more intense signal was observed around the nuclei, in the areas corresponding to
506 the median body, in the intracellular portion of ventral flagella and, intriguingly, at the ventral plasma
507 membrane. As shown, co-localization signal (pseudo color yellow) between gG3PD and NBDHEX was
508 evident only at plasma membrane, without any relevant alteration in the intracellular localization of
509 gG3PD (for comparison see Figure 1B and C, panels a). To further study the interaction between
510 NBDHEX and gG3PD, *E. coli* expressing the HIS-gG3PD was incubated with NBDHEX, then the
511 recombinant protein was purified and, finally, the enzymatic activity was assayed. Similar to the *in vivo*
512 treatment of *G. duodenalis* with NBDHEX, incubation of bacteria with the compound resulted in a
513 recombinant HIS-gG3PD having a 25% reduced enzymatic activity (Figure 6B). Next, we wondered
514 whether NBDHEX could bind HIS-gG3PD. We take advantage of the property of NBD derivatives
515 covalently bound to a protein to be visualized by fluorescence under ultraviolet (UV) light after SDS-
516 PAGE (Bragg and Hou, 1999). Indeed, HIS-gG3PD, purified from NBDHEX treated bacteria, was
517 fluorescent under UV-light (Figure 6C, right panel), even in the presence of a reducing agent (such as
518 DTT). On the contrary, no fluorescence was associated with the HIS-gG3PD purified from untreated
519 bacteria. These results suggest that NBDHEX strongly binds HIS-gG3PD. To confirm this hypothesis,
520 purified HIS-gG3PD from bacteria, treated or not with NBDHEX, was subjected to mass spectrometry
521 analysis. MS/MS spectra were acquired matching two HIS-gG3PD peptides carrying NBDHEX
522 derived adducts on cysteine residues: the detected mass shift was compatible with an NBDHEX form
523 in which the nitro group was reduced to amine (Figure 6D). No adduct with the intact NBDHEX
524 moiety could be found, probably because it was unstable or not detectable under the applied

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525 experimental conditions. The presence of nitro-reduced NBDHEX adducts was in favor of an
526 electrochemical reduction of the drug, likely by gG3PD. Therefore, NBDHEX properties were
527 evaluated by spectrophotometric and fluorimetric analyses after *in vitro* incubation with HIS-gG3PD.
528 The UV-visible spectra of NBDHEX, incubated either with g3p or with HIS-gG3PD, showed the
529 typical peak centered around 430 nm (Figure 7A), even after 80 min of incubation (data not shown).
530 Incubation in the presence of both HIS-gG3PD and g3p led to the progressive decrease of the 430 nm
531 absorption peak and to the appearance of a less intense new one around 450-455 nm (Figure 7A). The
532 reaction was also associated with a change in color, from bright yellow to brown (Figure 7B, insert)
533 and the disappearance of the 525 nm emission peak of NBDHEX in the fluorescence spectra (Figure
534 7B). Since the amount of NBDHEX was in large excess compared to HIS-gG3PD, the observed
535 spectral alterations were not imputable to binding of NBDHEX to the enzyme, but they argued on
536 NBDHEX modification by the glycerol-3-phosphate dehydrogenase activity of HIS-gG3PD. Such
537 modifications could be ascribable to a partial or complete reduction of the nitro group to
538 hydroxylamine or amine. Chemical reduction of the NBDHEX nitro group to amine by sodium
539 dithionite, proved by mass spectrometry analysis (Supplemental Figure S4), resulted in the decrease of
540 the NBDHEX absorption peak at 430 nm, although with the appearance of a new peak at 405 nm
541 (Figure 7C), and loss of fluorescence too (Figure 7D). The observed differences between UV-visible
542 spectra of HIS-gG3PD and sodium dithionite treated NBDHEX suggest that the enzymatic activity
543 produced an optical species, probably compatible with an incomplete reduced form of NBDHEX,
544 carrying an hydroxylamine instead of an amine moiety. On the other side, looking to the NBDHEX-
545 treated HIS-gG3PD, both in the presence or absence of g3p, the enzyme resulted fluorescent under UV
546 light after SDS-PAGE (Figure 7E). This suggests that protein adducts with the unreduced NBDHEX
547 occurred despite, enzyme activation. Products from *in vitro* reactions between HIS-gG3PD and
548 NBDHEX were also analyzed by mass spectrometry. In the sample incubated in the presence of g3p,
549 some HIS-gG3PD cysteine residues were modified by NBDHEX and MS/MS spectra analysis allowed
550 to detect mass shifts compatible with NBDHEX adducts carrying the NO₂ moiety completely reduced
551 to NH₂, but also the semi-reduced idroxylamine group (Supplemental Figure S5). These adducts could
552 not be detected when g3p was omitted.

553 Since toxicity of the nitrocompound MTZ over *G. duodenalis* has been related to its reduction to
554 nitrosoimidazole or hydroxylamine intermediate by flavin enzymes (Leitsch et al., 2007; Leitsch et al.,
555 2009; Leitsch et al., 2011), we asked whether the gG3PD could be able to nitroreduce MTZ. We then
556 monitored variation in the MTZ absorbance at 320 nm (Leitsch et al., 2011). As shown, no decrease in

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557 MTZ absorbance occurred even after 80 min of incubation in the presence of HIS-gG3PD and g3p
558 (Figure 7F), thus suggesting that in our experimental conditions MTZ is not nitroreduced by gG3PD.

559

560 **Discussion**

561 In this work we have characterized, for the first time, the FAD-dependent glycerol-3-phosphate
562 dehydrogenase of *G. duodenalis* both at molecular and functional level, and we have shown that the
563 antitumoral 7-nitro benzoxadiazole derivative NBDHEX displays a remarkable anti-giardial activity,
564 targets the gG3PD and, when *in vivo* administered to *G. duodenalis*, induces gG3PD activity reduction.
565 The full length gG3PD has no orthologues in other organisms, including humans, except for the
566 diplomonad *S. salmonicida* and the amebidae *Entamoeba* spp. The presence in the gram-positive
567 anaerobic actinobacteria *Eggerthella* spp. of an orthologue of the first 950 amino acids suggests that a
568 first gene fusion event between a GlpA-like glycerol-3-phosphate-dehydrogenase and a pyridine
569 nucleotide-disulphide oxidoreductase occurred in this prokaryotic lineage. A lateral gene transfer
570 (LGT) event could account for the presence of this multi-domain protein both in *G. duodenalis* and
571 *Entamoeba* spp., that share with *Eggerthella* spp. the mammalian intestine as ecological niche. LGT
572 events have been already well documented for genes of the anaerobic metabolism in eukaryotic
573 protozoan parasites such as *E. histolytica*, *T. vaginalis*, and *G. duodenalis* (as well as in *S. salmonicida*)
574 (Andersson et al., 2007; Morrison et al., 2007; Alsmark et al., 2009).

575 We demonstrate that the gG3PD is an active flavoenzyme able to use g3p as source of reducing
576 equivalents. In agreement with the domain topology and homology with bacterial GlpA subunit, the
577 enzymatic activity, as proven by deletion mutants, resides in the N-terminal half of the protein. It is
578 worth noting that the modest stimulatory effect exerted by additional FAD on the enzymatic activity of
579 both the gG3PD and the gG3PD_N, could be explained by different reasons i) the full length gG3PD is
580 fully complexed with FAD; and/or ii) the deletion mutant lacks the ability to properly bind FAD;
581 and/or iii) the enzyme needs FMN in addition to FAD. Indeed, the maximal activity of *E. coli* trimeric
582 GlpACB *in vitro* requires both FMN and FAD (Cole et al., 1988), whereas glpD binds only FAD (Yeh
583 et al., 2008). Furthermore, we show that gG3PD is able to dimerize and that the C-terminal half is
584 required for the dimer formation. The dimerization properties of this gG3PD region, absent in bacterial
585 GlpA, could be ascribable to its homology with members of the FAD-dependent pyridine nucleotide-
586 disulphide oxidoreductases, a family of generally dimeric proteins (Argyrou and Blanchard, 2004).

587 Localization of the gG3PD to the ventral plasma membrane, likely in correspondence to the
588 ventrolateral flanges, and the detection of the enzymatic activity in parasite extracts are in favor of the

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589 existence of functional glycerol biosynthetic pathway and of a role of the protein in *G. duodenalis*
590 energy metabolism. Similar to bacteria (Uden and Bongaerts, 1997), metabolization of g3p by *G.*
591 *duodenalis* could occur at plasma membrane via gG3PD thus providing an extra source of DHAP for
592 glycolysis and reducing equivalents to putative ETCs. Experimental evidences indicate that *G.*
593 *duodenalis* can proliferate *in vitro* even in absence of glucose, its main energy source (Adam, 2001),
594 either in the presence of serum (Schofield et al., 1991) or of a defined mixture of bile salts,
595 phosphatidylcholine (PC) and cholesterol (Gillin et al., 1986; Gault et al., 1987). Incorporation of free
596 glycerol and g3p in trophozoites has been reported to be negligible (Jarroll et al., 1981). Nevertheless,
597 mammalian bile and intestinal epithelium mucus are rich of PC, that is efficiently taken up by *G.*
598 *duodenalis* trophozoites (Stevens et al., 1997). PC, in turns, can potentially be converted to g3p by the
599 combined activity of a phospholipase PLB and a putative GPC-PDE, both encoded by *G. duodenalis*
600 genome (Yichoy et al., 2011; Morrison et al., 2007).

601 We show that the gG3PD activity increases early at encystation, without up-regulation of protein
602 expression. In this phase of encystation, energy metabolism and galactosamine synthesis require extra
603 carbon sources as consequence of the highly reduced glucose uptake and decrease in oxygen
604 consumption (Paget et al., 1998). We may speculate that gG3PD could provide extra carbon to
605 glycolysis, via an improved metabolization of g3p to DHAP. In parallel, we also observed an increase
606 in intracellular glycerol levels. In response to stress conditions, including hyperosmotic stress, several
607 microorganisms synthesized glycerol as stress protector via an increased DHAP to g3p conversion
608 mediated by the NAD(P)H-dependent G3PD (Albertyn et al., 1994; Yang et al., 2007; Chen et al.,
609 2012; Suescún-Bolívar and Thomé, 2015). The increase in the bile salt, together with a slight alkaline
610 pH, is a key encystation signal eventually perceived by *G. duodenalis* as hyperosmotic stress. It is
611 worth to note that, in *E. histolytica*, intracellular accumulation of both g3p and glycerol occurs in
612 response to oxidative stress despite only the gG3PD orthologue is present and no NAD(P)H-dependent
613 G3PD activity has been detected (Husain et al., 2012). The unusual domain architecture of FAD-
614 dependent G3PDs from both *G. duodenalis* and *E. histolytica* may explained for a bi-directional activity
615 of this enzymes A further characterization of the gG3PD and a detailed metabolomics analysis of the
616 trophozoite and encystation stage of *G. duodenalis* will be necessary to unravel any metabolic re-
617 arrangement occurring during the parasite differentiation and its link with gG3PD activity.

618 The subcellular localization of gG3PD requires also other considerations. The presence, only in
619 trophozoites but not in encysting parasites, of a fraction of the enzyme in the membrane preparation is
620 in agreement with the immunolocalization data and suggests that gG3PD can associate with

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621 membranes in a stage dependent-manner. The structural/sequence determinant(s) responsible for the
622 localization of the protein may reside in the N-terminal half of gG3PD, as supported by the partial
623 localization of the gG3PD_N deletion mutant to the ventrolateral side of the trophozoite. In addition,
624 we confirm that gG3PD and g14-3-3 co-precipitate (this work; Lalle et al., 2012) mainly at the
625 trophozoite stage implying a role of the g14-3-3 in gG3PD localization to ventral plasma membrane.
626 The presence of several putative mode-1 and mode-2 binding sites along the sequence of gG3PD
627 (Supplemental Figure S1; Lalle et al., 2012) can allow for a direct interaction between the two proteins.
628 Nevertheless, we cannot exclude that the interaction between gG3PD and g14-3-3 is indirect and that
629 both proteins are present in a multiprotein complex, and further studies with different deletion and
630 point mutants will clarify this issue. However, beyond the exact interaction mechanism, a clear
631 relationship between g14-3-3 and gG3PD localization and, possibly, its enzymatic activity, is indicated
632 by the strongly reduced co-precipitation of g14-3-3 with gG3PD during encystation and the partial re-
633 localization of gG3PD to mitosomes.

634 The re-localization of gG3PD to mitosomes, despite the absence of any predictable mitochondrial
635 targeting sequence or cleavage site in the N-terminus, has been proved at least for another *G.*
636 *duodenalis* protein, namely GiiscS (Dolezal et al., 2005). In our case, the lost of mitosomal localization
637 in both gG3PD deletion mutants suggests that targeting to these organelles at least requires the full-
638 length protein. Although *G. duodenalis* mitosomes clearly miss the TCA cycle and the typical ATP-
639 generating mitochondrial respiratory ETC (Han and Collins, 2012), the encystation-dependent
640 localization of gG3PD to mitosomes could be a reminiscence of mitochondrial function of mG3PDs,
641 where they participate in the g3p shuttle and supply electrons to the mitochondria ETC. A homolog of
642 FAD-dependent mG3PD has been identified also in the mitosomes of the microsporidia *Antonospora*
643 *locustae*, a group of spore-forming fungus-related intracellular parasites (Dolgikh et al., 2011). The
644 protein is expressed in the spore and localizes in the mitosomes, where it channels reducing equivalent
645 to the so called alternative oxidase (Dolgikh et al., 2011). Similarly, the presence of alternative ETCs in
646 *G. duodenalis*, as in the anaerobic bacteria respiration, cannot be excluded (Unden and Bongaerts,
647 1997; Han and Collins, 2012). GiOR-1, a di-flavoprotein able to reduce the gCYTb5-IV and having
648 ferredoxin-independent and NADPH-dependent reductase activity, has been localized to the *G.*
649 *duodenalis* mitosome, suggesting that a NAD(P)-dependent ETC exists in this organelle (Jedelský et
650 al., 2011; Pyrih et al., 2014). Similarly, the presence of a pyridine nucleotide-disulphide oxidoreductase
651 domain and of a putative metal binding domain in gG3PD, both present in the flavoprotein reductase
652 family (Argyrou and Blanchard, 2004), may imply that the protein possesses a combined

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653 dehydrogenase and reductase activity, although the final acceptor, if any, is still to be identified. Our
654 results disclose a new perspective on the role of mitosome in *G. duodenalis* suggesting that mitosomal
655 components and functions can change during the parasite life cycle. Indeed, gG3PD was not detected in
656 the proteome of mitosomes isolated from trophozoites (Jedelský et al., 2011).

657 Looking for compounds affecting the gG3PD activity, we demonstrate that the 7-nitro benzoxadiazole
658 derivative NBDHEX, a patented anti-tumor drug (Ricci et al. 2005; Turella et al. 2005), exerts
659 cytotoxic activity towards *G. duodenalis* trophozoites and, when administered *in vivo*, hampers the g3p
660 dehydrogenase activity of gG3PD. The IC₅₀ of NBDHEX is 2- to 5-fold lower than MTZ, proving that
661 the compound is more effective in killing *G. duodenalis* than the reference drug, even in microaerobic
662 conditions. This indicates that the presence of O₂ does not produce opposite effects on NBDHEX, as on
663 the contrary occurs for re-oxidation of MTZ nitroradical anions. *G. duodenalis* is a microaerophilic
664 parasite that lives in the fairly aerobic (up to 60 μM O₂) environment of the upper intestine, so that a
665 drug potentially effective also in presence of O₂ is more attractive for therapeutic use. We show that
666 NBDHEX binds to gG3PD, when administered both *in vivo* and *in vitro*. NBDHEX is an excellent
667 electrophile that can easily form σ-complexes, as occurs between glutathione and the C-4 position of
668 the drug in the G-site of GST, leading to the inhibition of the detoxifying and anti-apoptotic activity of
669 human GSTP1-1 (Ricci et al., 2005; Federici et al., 2009). Since no gene coding for GST is present in
670 *G. duodenalis* (Morrison et al., 2007), we can *bona fide* exclude that anti-giardial activity of NBDHEX
671 may be due to any GST inhibition, although a low level of GSH has been detected (Krauth-Siegel and
672 Leroux, 2012). The formation of σ-complexes likely occurs between NBDHEX and gG3PD, as
673 suggested by in gel fluorescence of gG3PD after NBDHEX treatment, but, unfortunately, our attempts
674 to identify these complexes by mass spectrometry were unsuccessful. Furthermore, we demonstrate the
675 occurrence of NBDHEX covalent adducts at several gG3PD cysteine residues, with the 7-nitro group
676 of the drug being reduced either completely to amine or partially to hydroxylamine. Different
677 NBDHEX modified cysteine residues of His-gG3PD were found in different experimental conditions,
678 i.e. NBDHEX treatment *in E. coli* or *in vitro*, likely as the result of a differential accessibility of the
679 drug to such residues. Our *in vitro* assays and MS data indicate that the nitro reduced NBDHEX
680 adducts derive from the gG3PD-mediated electrochemical reduction of the drug, possibly via the
681 formation of highly reactive intermediates, such as nitroso or hydroxylamine radicals. It is well known
682 that during the FAD-mG3PD-mediated oxidation of the 2-hydroxy group of g3p, to form DHAP, two
683 electrons are transferred to FAD and then to the quinone pool (Mráček et al., 2013). Similarly, gG3PD
684 activity can generate two electrons able to reduce the nitro group to a hydroxylamine intermediate.

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685 Enzymatic reduction has also been proposed as a mechanism for the activation of nitrocompounds, i.e.
686 MTZ, leading to protein covalent adducts formation and cytotoxicity in several microaerophilic
687 protozoan parasites. In particular, the flavoprotein thioredoxin reductase (TRxR) can nitroreduce MTZ,
688 by a process involving its flavin cofactor, thus forming covalent adducts with the drug (Leitsch et al.,
689 2007; Leitsch et al., 2009; Leitsch et al., 2011). Remarkably, although gG3PD displays nitroreductase
690 activity toward NBDHEX, no nitroreduction of MTZ could be observed in our experimental
691 conditions. Nitroimidazoles and other nitrocompounds seem to be metabolized in *G. duodenalis* in a
692 different manner, also in comparison to *E. histolytica* and *T. vaginalis*, and protein adducts can be
693 formed only with some of these drugs (Leitsch et al., 2012). Indeed, gG3PD was not identified among
694 the proteins forming adducts with MTZ or tinidazole neither in *G. duodenalis* nor in *E. histolytica*
695 (Leitsch et al., 2012; Leitsch et al., 2007). In particular, these differences in nitrocompound
696 metabolization have been related to the adaptation of *G. duodenalis* to rather high concentrations of O₂
697 in the upper small intestine. We can speculate that gG3PD-mediated NBDHEX nitroreduction may be
698 influenced by a redox-cycling property of 7-nitro benzoxadiazole derivative in presence of O₂. NBF-
699 SPh, a compound related to NBDHEX, has a redox-cycling activity with nitro group cycling to nitroso
700 and hydroxylamine intermediates by reversible electron transfer to O₂ before becoming exhausted and
701 finally reduced to amine (Patridge et al., 2012). During redox-cycling, NBF-SPh rapidly converts O₂ to
702 reactive oxygen species (ROS) at an higher rate than that of the most toxic redox-cycling quinones and
703 the nitrocompound MTZ. Bio-reduction of the redox cycling naphthoquinone menadione by
704 flavoprotein/iron-sulphur-mediated electron transfer in both *G. duodenalis* trophozoites and cysts has
705 been proven to be a potent generator of ROS, even in the presence of low levels of oxygen, thus
706 leading to parasite killing (Paget et al., 2004). Therefore, we propose that the cytotoxicity exerted by
707 NBDHEX against *G. duodenalis* could be due to its nitroreduction and to ROS generation during the
708 reductive process, likely involving gG3PD. Finally, it should be considered that nitroreduction of
709 NBDHEX, at least in part mediated by gG3PD, could subtract electrons from their physiological
710 acceptor(s) thus altering the *G. duodenalis* intracellular redox metabolism.

711 Although further studies are necessary to fully understand the metabolic pathways involving the
712 gG3PD, as well as the mechanisms of the enzyme regulation in *G. duodenalis*, we have clearly proven,
713 for the first time, that a functional FAD-dependent glycerol-3-phosphate dehydrogenase works in *G.*
714 *duodenalis* and could be a valuable potential candidate for the design of novel anti-giardial drugs having
715 NBDHEX, a representative of novel class of antitumoral molecules, as leading compound.

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908 **Figure legends**

909

910 **Figure 1. Expression and localization of the gG3PD during the differentiation stages of *G.***
911 ***duodenalis*.** A) Western blot from three independent analysis of Triton lysates (20 μ g) from *G.*
912 *duodenalis* WB-C6 trophozoites (T) and parasites harvested at 6, 12 and 24h after encystation
913 induction. Immunoblotting was performed with: anti-gG3PD polyclonal serum (α -gG3PD); anti-
914 phosphoacetylglucosamine mutase (α -PGM) (Lopez et al., 2003), to follow the progression of
915 encystation; the anti- α -tubulin (α - α -TUB), as loading control. Molecular size markers (kDa) are
916 reported on the left. The analysis is representative of three independent experiments. B) CLSM
917 observations of fixed and permeabilized *G. duodenalis* WB-C6 parasites at different stages: trophozoite
918 (panel a, Troph.), encysting parasite after 12h of encystation (panel b and c, Encyst.) and cyst (panel
919 d, Cyst) stained with the mouse polyclonal serum α -gG3PD (red) and the α -g14-3-3 rabbit polyclonal
920 (green). Cyst wall and encystation specific vesicles (ESVs) were stained with Cy3-conjugated α -CWP
921 mAb (grey). Nuclei (N) were stained with DAPI (blue). Displayed micrographs correspond to a single
922 z-stack: a and b, ventral stacks; c and d, central stacks encompassing the nuclei. T, transmission light
923 acquisition. Scale bars, 5 μ m. Arrows indicate the ventrolateral flanges (VLF). A magnification (zoom)
924 of the indicated area in the merged image is shown. C) CLSM observation as in B. Parasites were
925 stained with α -gG3PD (red) and α -Tom40 antiserum (green) (Dagley et al., 2009). Nuclei (N) were
926 stained with DAPI (blue). A magnification (zoom) of the indicated area in the merged image is shown.
927 Mitosomes are indicated (m). Images in B) and C) are representative of >50 fields analyzed in two
928 independent experiments.

929

930 **Figure 2. Expression of the recombinant FLAG-HA-gG3PD in *G. duodenalis* and its interaction**
931 **with g14-3-3.** A) Western blot analysis of Triton lysates from trophozoites (T) or parasites after 12h of
932 encystation (E) obtained from FLAG-HA-gG3PD transfected line or from the control WBC6 strain. 20
933 μ g of protein extracts were loaded in each lane and separated on a 4-12% SDS-PAGE, then transferred
934 on nitrocellulose membrane and finally probed with the indicated antibodies. Equal protein loading was
935 monitored by anti-TUB Ab, whereas encystation induction was confirmed by anti-gPGM Ab.
936 Molecular size markers (kDa) are reported in the left. B) Subcellular distribution of gG3PD. 30 μ g of
937 fractionated protein lysate, soluble (S) or octyl β -D-glucopyranoside solubilized membrane proteins
938 (M), from trophozoites (T) or 12h encysting parasites (E) of FLAG-HA-gG3PD transfected parasites or
939 control WB-C6, were treated as described in (A) and probed with the indicated antibodies. Molecular

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940 size markers are on the left. C) Co-immunoprecipitation assay of endogenous g14-3-3 with FLAG-HA-
941 gG3PD. An aliquot (1:5) of the FLAG peptide-eluted material from WB-C6 or FLAG-HA-gG3PD
942 transgenic line, deriving from trophozoites (T) or encysting parasite (E), was separated on 4-12% SDS-
943 PAGE and immunoblotted with anti-HA (α -HA) or anti-g14-3-3 polyclonal serum (α -g14-3-3).
944 Molecular size markers are on the left. Immunoblots of panel A), B) and C) are representative of three
945 independent experiments.

946

947 **Figure 3. Expression and intracellular localization of the FLAG-HA-tagged gG3PD deletion**
948 **mutants in *G. duodenalis* parasites.** A) Representative western blot analysis of soluble protein lysate
949 (20 μ g) from control WB-C6 and transgenic trophozoites (T) or parasites after 12h of encystation (E),
950 expressing the full-length FLAG-HA-gG3PD, or the FLAG-HA-gG3PD_N or _C. Lysates were
951 separated on 4-12% SDS-PAGE and immunoblotted with the indicated antibodies. Arrows on the right
952 indicate the molecular size of the corresponding proteins. Molecular size markers are on the left. The
953 vertical line in the panel corresponding to the α -HA blotting indicates two different times of exposure
954 between the samples of the same gel. The immunoblots are representative of three independent
955 experiments. B) CLSM observations of fixed and permeabilized transgenic *G. duodenalis* parasite
956 expressing the FLAG-HA-gG3PD_N or the FLAG-HA-gG3PD_C at different stages: trophozoite
957 (panels a and d, Troph.), encysting parasites after 12h of encystation (panels b and e, Encyst.) and
958 cysts (panels c and f, Cyst). Parasites were stained with mouse α -HA mAb (green) and rabbit
959 polyclonal α -g14-3-3 (red). Cyst wall and encystation specific vesicles (ESVs) were stained by Cy3-
960 conjugated α -CWP mAb (grey). Nuclei were DAPI-stained (blue). Displayed micrographs correspond
961 to a single z-stack. T, transmission light acquisition. Scale bars are reported. Arrows indicate the
962 ventral plasma membrane and ventrolateral flanges (VLF). Images are representative of >50 fields
963 analyzed in two independent experiments.

964

965 **Figure 4. Evaluation of the gG3PD enzymatic activity.** A) Spectrophotometric analysis of purified
966 HIS-gG3PD. The UV-visible spectrum of HIS-gG3PD (10 mg/ml) in 67 mM of potassium phosphate
967 buffer, pH 7.5, was recorded at 25°C. The insert shows a magnification of the HIS-gG3PD spectrum
968 (solid line) in comparison with the spectrum of authentic FAD (dotted line) recorded in the same
969 buffer. Peak maxima are reported. Spectra are representative of three independent experiments. B)
970 Assessment of HIS-gG3PD dimerization *in vitro*. Purified recombinant proteins (3 μ mol) were
971 separated on 3–12% Blue Native-PAGE and silver-stained or transferred on polyvinylidene difluoride

32

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972 (PVDF) membrane and probed with anti-HIS mAb. Native size markers (kDa) are indicated on the left.
973 Asterisks indicate HIS-gG3PD monomer (*) or dimer (**). Empty dots indicate HIS-gG3PD_C
974 monomer (°) or dimer (°°). The arrow indicates HIS-gG3PD_N monomer (<). Native-PAGE and
975 immunoblot are representative of three independent experiments. C) The enzymatic activities of both
976 the purified HIS-gG3PD and the deletion mutant HIS-gG3PD_N were measured *in vitro*, by MTT
977 assay, in the presence (+FAD) or absence (no FAD) of 10µM FAD. The G3PD activity (mean ± SD)
978 from three independent experiments is expressed as nmol of reduced MTT per min per mg of
979 recombinant protein. Statistical analyses were performed using unpaired t-test between the full length
980 and the deletion mutant: * P< 0.05 and ** P< 0.01. D) The FAD-glycerol-3-phosphate dehydrogenase
981 activity was measured in protein extract (100 µg) from *G. duodenalis* trophozoites (Troph.) or in
982 parasite after 6h or 12h from encystation induction (Encyst.). The relative enzymatic activity (mean ±
983 SD) from three independent experiments is expressed as the percentage change respect to the value
984 measured in trophozoites. Statistical analyses were performed using unpaired t-test (Troph vs Encyst 6h
985 (** P<0.01) and Troph vs Encyst 12h (ns)), and one-way ANOVA (°° P<0.001). E) Western blot
986 analysis of protein extracts (20 µg) used to assay the gG3PD enzymatic activity (as described in D),
987 extracts were separated on 4-12% SDS-PAGE and immunoblotted with the indicated antibodies.
988 Molecular size markers are indicated on the left. Immunoblot is representative of three independent
989 experiments. F) The intracellular glycerol content was measured in supernatant from *G. duodenalis*
990 trophozoites (Troph) and parasites after 6h or 12h from encystation induction (Encyst.). The relative
991 glycerol amount of three independent experiments (mean ± SD) is expressed as the percentage change
992 respect to the amount detected in trophozoites. Statistical analyses were performed using unpaired t-test
993 between Troph and Encyst 6h (***) P<0.001) and Troph vs Encyst 12h (** P<0.01). One-way ANOVA
994 confirmed that differences among groups were statistically significant (°° P<0.001).

995

996 **Figure 5. Evaluation of NBDHEX effects on *G. duodenalis* growth and gG3PD enzymatic activity.**

997 A) Survival of *G. duodenalis* WBC6 trophozoites was determined by methylene blue colorimetric
998 assay after 48h of treatment with different concentrations, ranging from 0.05 to 10 µM, of NBDHEX
999 (empty dots) or metronidazole (MTZ, empty squares) in microaerophilic growth conditions. Data
1000 (mean percentage ± SD) represent three independent experiments, each done in triplicate. The structure
1001 of the NBDHEX compound is reported in the insert. B) The FAD-glycerol-3-phosphate dehydrogenase
1002 activity was measured in protein extract (100 µg) from *G. duodenalis* trophozoites treated for the
1003 indicated times with 50 µM NBDHEX or for 6h with ethanol (Control). The enzymatic activity of three

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1004 independent experiments (mean \pm SD) is expressed as the percentage change respect to the control.
1005 Unpaired t-test was performed between control and each time point (* $P < 0.05$ and ** $P < 0.01$). One-
1006 way ANOVA indicated statistically significant differences among all stages (°°° $P < 0.0001$). C) 20 μ g
1007 of protein extracts derived from trophozoites treated as described in (B), were separated on 4-12%
1008 SDS-PAGE and immunoblotted. A representative western blot analysis is shown and the antibodies
1009 indicated. Molecular size markers are reported in the left. Table in the bottom reports the densitometric
1010 analysis of three independent experiments (mean \pm SD). Statistical analyses using t-test were not
1011 significant.

1012

1013 **Figure 6. Interaction of NBDHEX with gG3PD.** A) CLSM analysis of fixed and permeabilized *G.*
1014 *duodenalis* WBC6 trophozoites after 2h incubation with 50 μ M NBDHEX. NBDHEX (green) was
1015 directly visualized using the laser light at 488 nm ex. Parasites were stained with rabbit polyclonal anti-
1016 g14-3-3 and AlexaFluor 647-conjugated anti-rabbit (red). Nuclei were stained with DAPI (blue).
1017 Displayed micrographs correspond to a single z-stack. T, transmission light acquisition. Scale bar is
1018 reported. Images are representative of >50 fields analyzed in two independent experiments. B)
1019 Histograms represent the FAD-glycerol-3-phosphate dehydrogenase activity (mean percentage \pm SD)
1020 of recombinant HIS-gG3PD (16 pmol) purified from HIS-gG3PD-overproducing *E. coli* after 2h
1021 incubation with 50 μ M NBDHEX (NBDHEX) or ethanol (Control). The relative change in the
1022 enzymatic activity is given as percentage in relation to the control. Statistical analyses were performed
1023 using unpaired t-test (**** $P < 0.0001$) on three independent experiments. C) SDS-PAGE (4-12%) of 2
1024 μ g of purified NBDHEX-treated (NBDHEX) or ethanol-treated (Control) HIS-gG3PD, as described in
1025 (B), under reducing (+DTT) or not reducing condition. On the left, gel stained with Coomassie blue; on
1026 the right, the same gel photographed under UV light prior to staining. Molecular size markers are
1027 indicated on the left. D) MS/MS spectra matching the gG3PD peptides (residues 539-551, left panel,
1028 and residues 859-872, right panel) carrying a mass increase of 265 Da on the cysteine residues C545
1029 and C865, respectively. The mass shift is compatible with an NBDHEX-derived adduct in which the
1030 nitro group was completely reduced to an amine. Data shown in C) and D) are representative of three
1031 independent experiments.

1032

1033 **Figure 7. NBDHEX is substrate of HIS-gG3PD.** A) Spectrophotometric analysis of the reaction
1034 between NBDHEX and gG3PD. The UV-visible spectrum of NBDHEX (100 μ M) in 67 mM potassium
1035 phosphate buffer (pH 7.5) was recorded at 25°C either in the presence of 17 mM g3p (red line, +g3p)

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1036 or 80 nM HIS-gG3PD (dashed black line, +HIS-gG3PD). The NBDHEX (100 μ M) UV-visible
1037 spectrum was also recorded at different time points (0, 10, 20, 40 and 80 min) in the presence of both
1038 17 mM g3p and 80 nM HIS-gG3PD (+HIS-gG3PD+g3p). Arrows indicate the wavelength (nm) of the
1039 maximal absorption. B) Fluorescence spectra of 100 μ M NBDHEX (excitation at 430 nm) after 80 min
1040 of incubation with 80 nM HIS-gG3PD, either in the presence (solid line) or absence (dashed line) of 17
1041 mM g3p. Fluorimetric analyses were recorded at 25°C in 67 mM potassium phosphate buffer (pH 7.5).
1042 NBDHEX fluorescence emission has a maximum peak wavelength at 525 nm. Fluorescence intensity
1043 (y axis) is arbitrary. The change in color of the two reactions is shown in the insert. C) The UV-visible
1044 spectrum of NBDHEX (100 μ M) in 67 mM potassium phosphate buffer (pH 7.5) was recorded at 25°C
1045 before (solid line) and after (dashed line) treatment with sodium dithionite (Na₂S₂O₄). The wavelengths
1046 (nm) of the maximal absorption are indicated with arrows. D) Fluorescence spectra of 100 μ M
1047 NBDHEX (excitation at 430 nm) before (solid line) and after Na₂S₂O₄ (dashed line). The slight change
1048 in color of the two conditions is shown in the insert. Spectra and images from A) to D) are
1049 representative of three independent experiments. E) SDS-PAGE (4-12%) of 2 μ g of HIS-gG3PD after
1050 80 min of incubation at 25°C with NBDHEX (+NBDHEX) in the presence or not of g3p, or with
1051 ethanol (no NBDHEX). Gel was photographed under UV light (UV, right panel) before staining with
1052 Coomassie blue (Coomassie, left panel). Molecular size markers are reported in the left. Images are
1053 representative of three independent experiments. F) Comparison of the UV-visible spectra of
1054 NBDHEX (green and orange line) or MTZ (solid and dashed line) incubated with HIS-gG3PD and g3p
1055 (G3PD) at time 0 min and after 80 min of incubation at 25°C (T0 and T80, respectively). Arrows
1056 indicate the wavelengths (nm) of the maximal absorption. Spectra are representative of three
1057 independent experiments.
1058

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1059 **Tables**

1060

1061 **Table 1.** Primer list

Target	Forward primer ^a	Reverse primer ^b
Full length gG3PD	gG3PDforw 5'- <u>GGATCC</u> ACCACCGCTCACCCTTTACC-3'	gG3PDrev 5'- <u>GCGGCCGCT</u> CACTTCATAGCCGGAATGTTTC-3'
N-terminal gG3PD	gG3PDforw	NTrev 5'- <u>GCGGCCGCT</u> CAGTATGCCTTGCCATCGGGGTG-3'
C-terminal gG3PD	CTforw 5'- <u>GGATCC</u> ACCCCGATGGACAAGGCATAC-3'	gG3PDrev

1062 a The BamHI site is underlined.

1063 b The NotI site is underlined.

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Figure 1.TIF

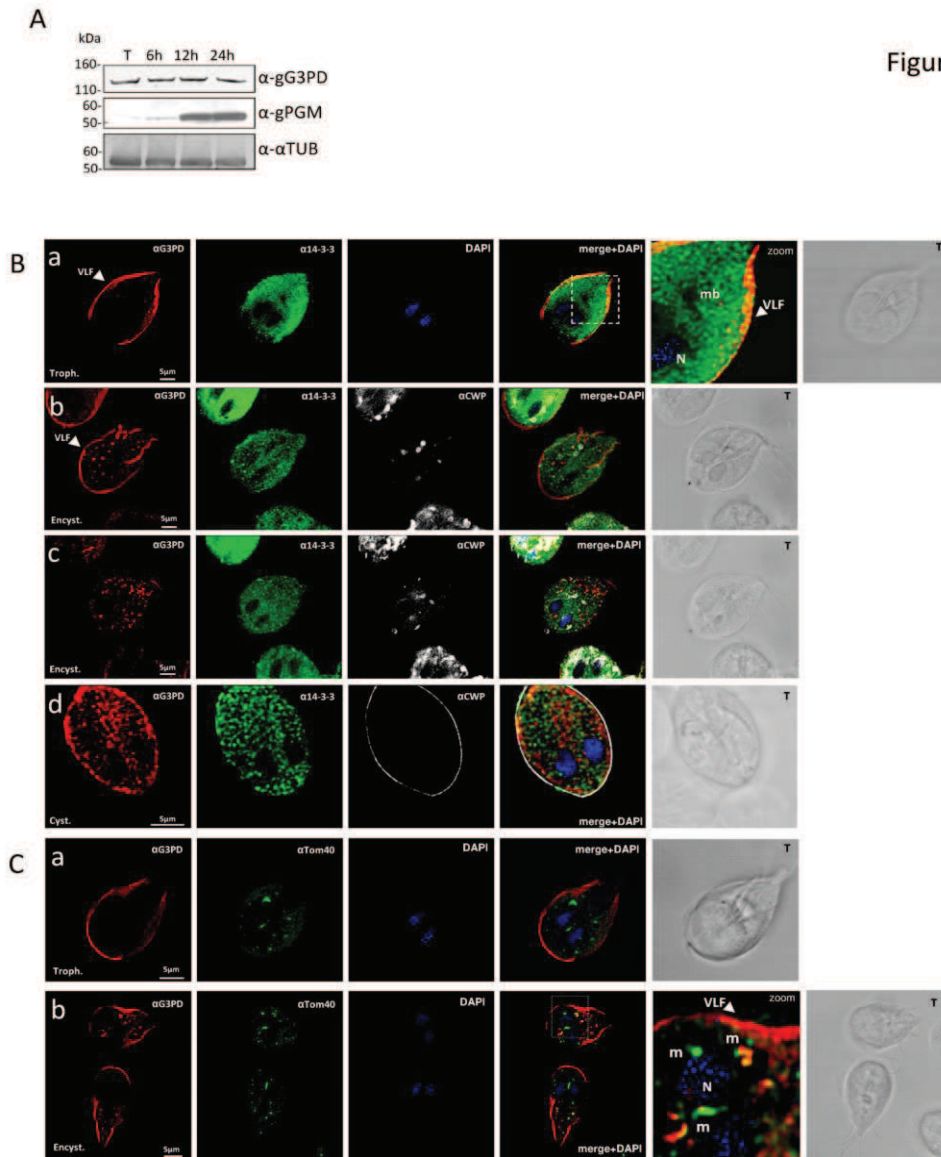


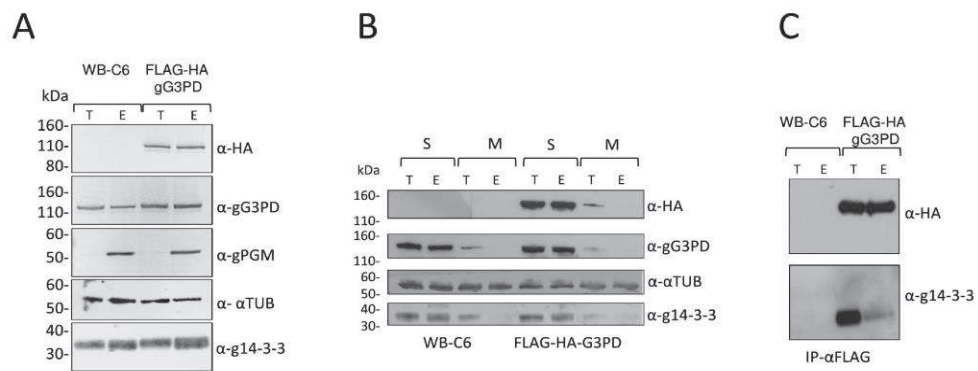
Figure 1

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Figure 2.TIF

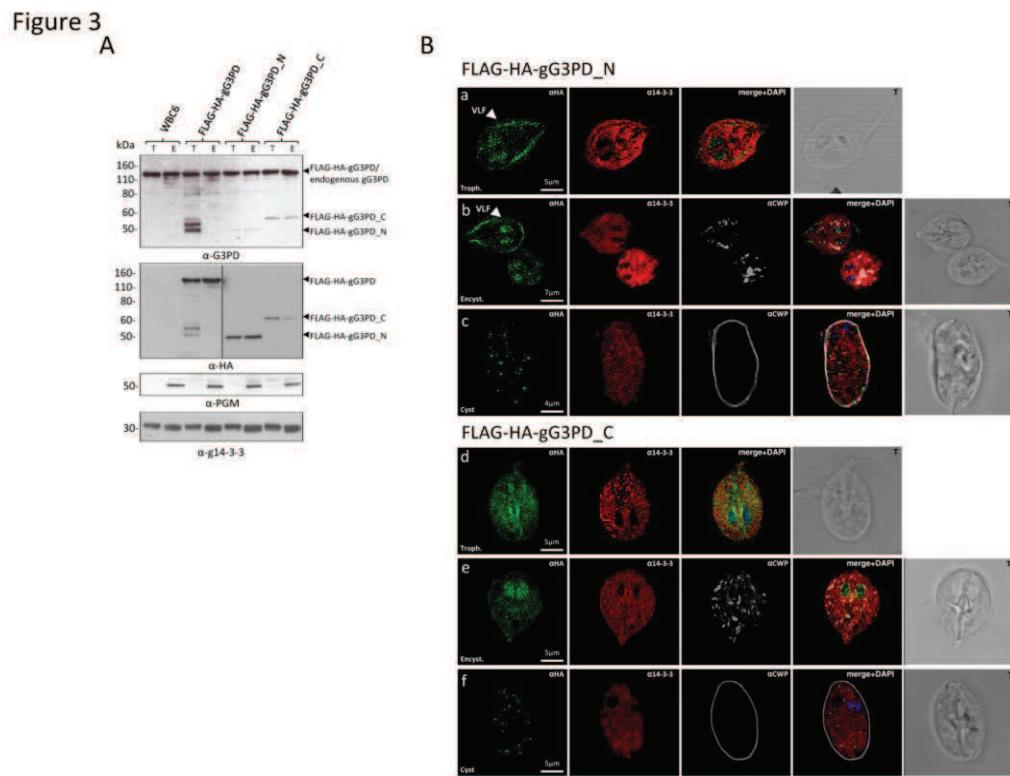
Figure 2



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Figure 3.TIF

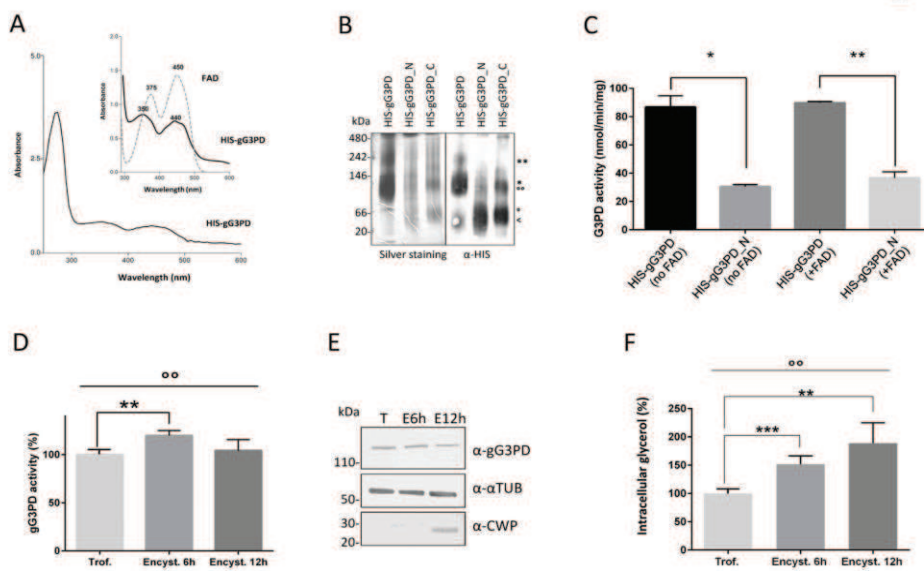


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Figure 4.TIF

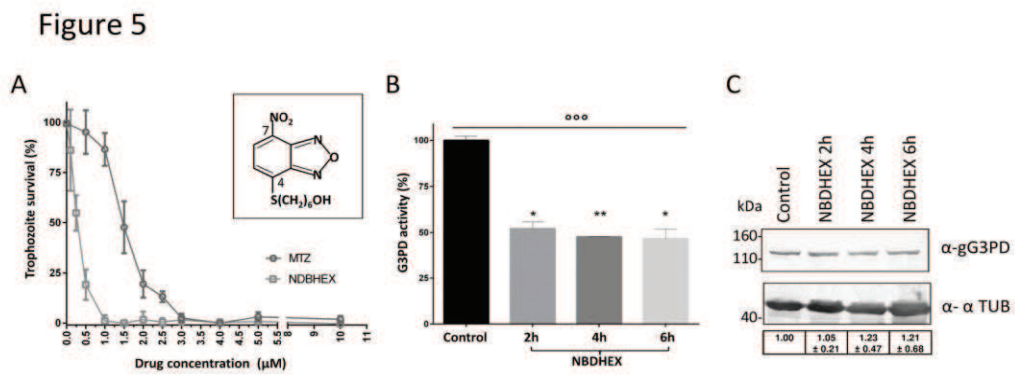
Figure 4



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Figure 5.TIF

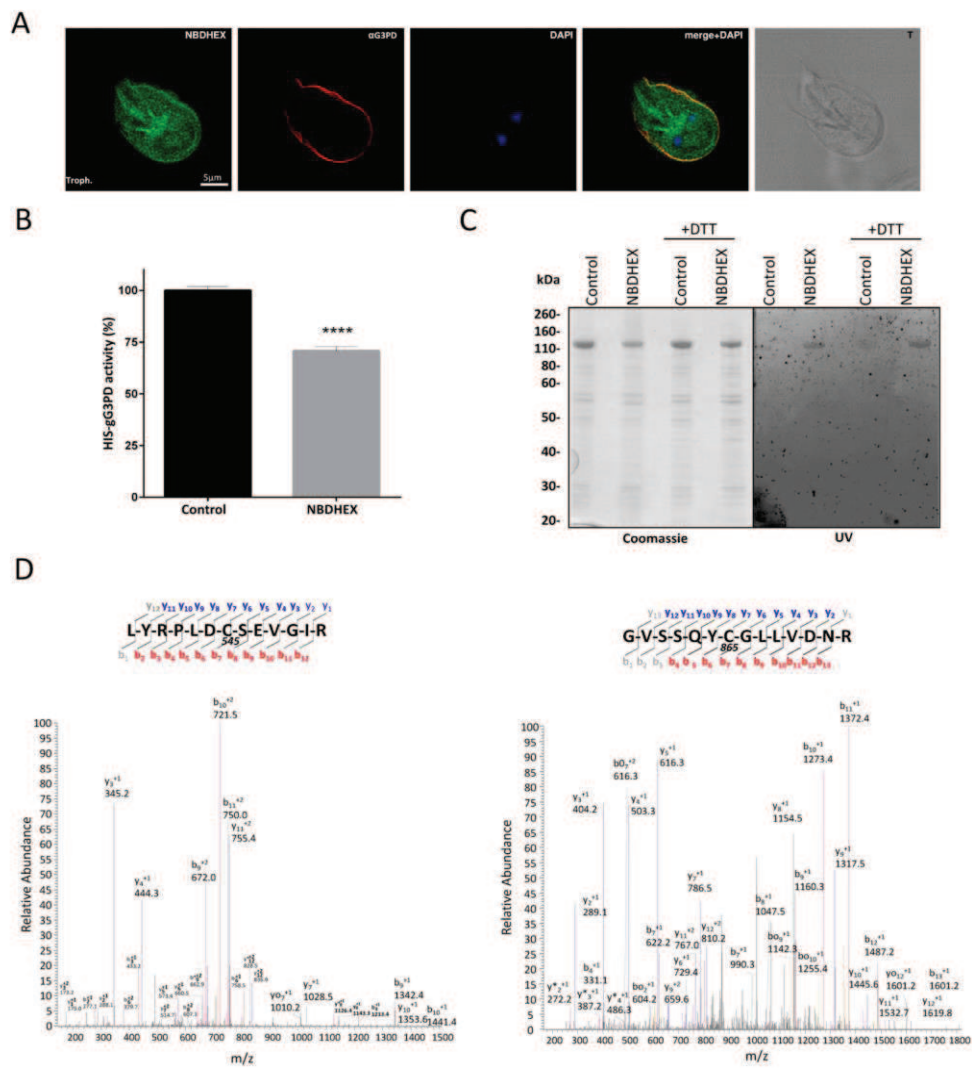


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Figure 6.TIF

Figure 6

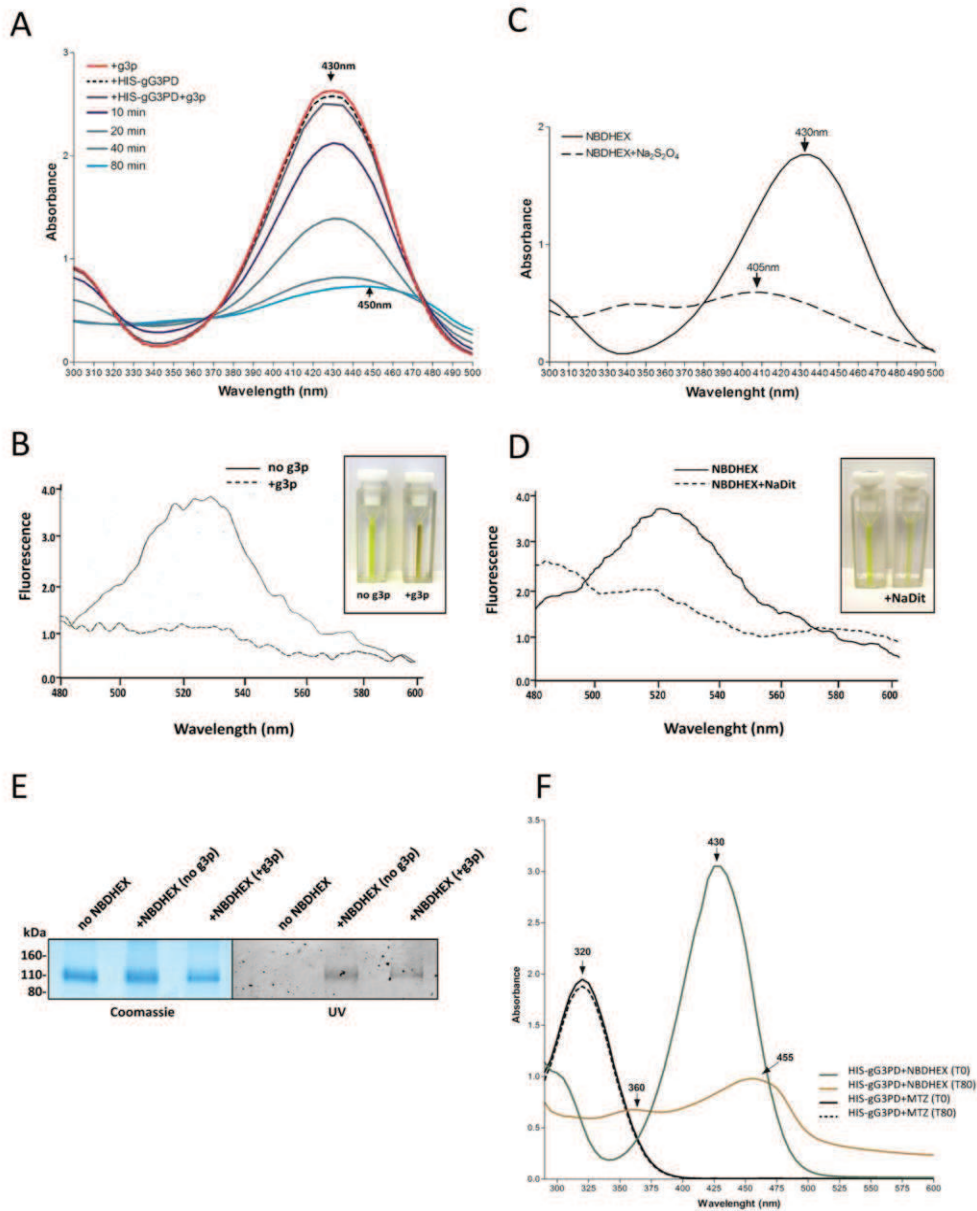


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Figure 7.TIF

Figure 7



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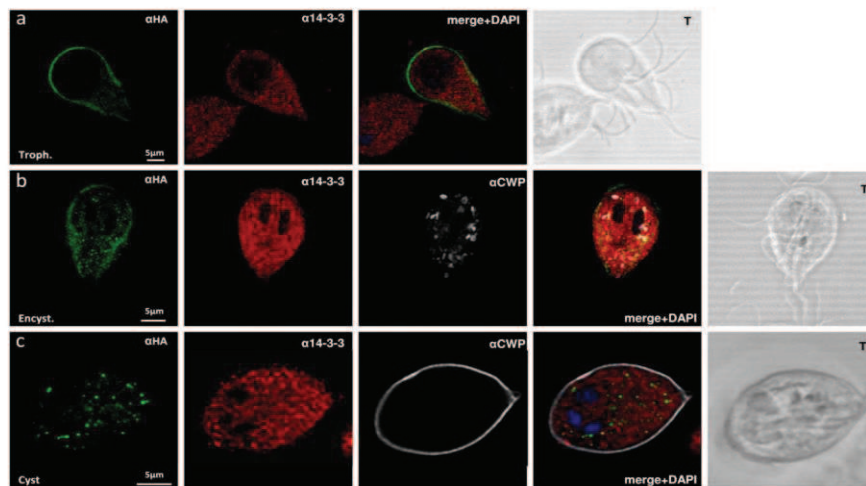
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domain found in hypothetical metal-binding proteins (DUF 1667, residues 587-910). Putative 14-3-3 binding site (according to Lalle et al., 2012) are in bold and underlined. Residues common to both the N- and C-terminal half constructs of the gG3PD are in bold and italic. **B) Multiple sequence alignment of the first portion of the G3PD from different species.** Multiple sequence alignment of the first portion (residues 1-510, including the glycerol-3-phosphate dehydrogenase-like domain) of *Giardia duodenalis* gG3PD (accession number: GL50803_16125) with the identified closer orthologues from *Entamoeba histolytica* (C4M6H3) and *Eggerthella lenta* (C8WGG6), and with the *Escherichia coli* anaerobic-glycerol-3-phosphate dehydrogenase subunit A (GlpA, POA9C0), the *E. coli* aerobic glycerol-3-phosphate dehydrogenase (GlpD, P13035), the closely related glycerol-3-phosphate oxidase from *Enterococcus faecalis* (GlpO, F0PH56) and the human mitochondrial mG3PD (GPD2, P43304). Conserved residues above 30% of identity are highlighted in blue. Darker is the blue, higher is the degree of identity at the position. Orange box, Flavin Adenine Dinucleotide (FAD)-binding motif. Green box, residues that tightly interact (hydrogen bonding and hydrophobic interactions) with FAD and yellow box, residues potentially involved in glycerol-3-phosphate binding (according to Colussi, et al, 2008 and Yeh, et al, 2008).

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Supplemental Figure S2

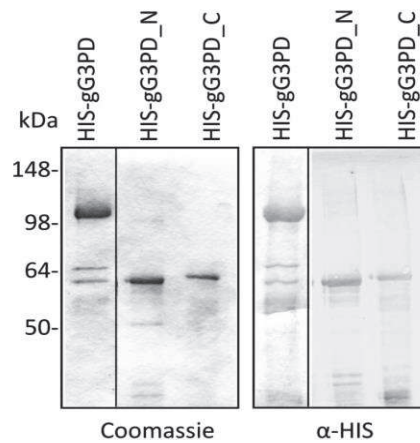


Supplemental Figure S2. Localization of the FLAG-HA-gG3PD during the differentiation stages of *G. duodenalis*. CLSM observations of fixed and permeabilized *G. duodenalis* WB-C6 transgenic parasites expressing the FLAG-HA-gG3PD protein. Trophozoite (panel a, Troph.), encysting parasite after 12h of encystation (panel b and c, Encyst.) and cyst (panel d, Cyst) stained with mouse α -HA mAb (green) and rabbit polyclonal α -g14-3-3 (red). Cyst wall and encystation specific vesicles (ESVs) were stained with Cy3-conjugated α -CWP mAb (grey). Nuclei were stained with DAPI (blue). Displayed micrographs correspond to a single z-stack. T, transmission light acquisition. Scale bars, 5 μ m.

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Supplemental Figure S3

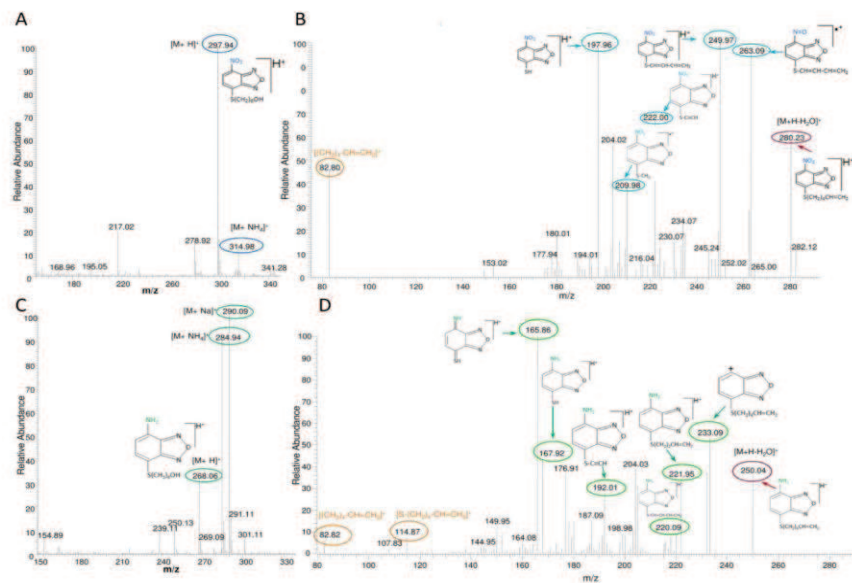


Supplemental Figure S3. Expression of recombinant HIS-gG3PD and deletion mutants in *Escherichia coli*. An aliquot of nickel-affinity purified recombinant HIS-gG3PD (2 mg), HIS-gG3PD_N (0.5 mg) and HIS-gG3PD_C (0.5 mg) were separated on 4-12% SDS-PAGE and either stained with Coomassie blue (Coomassie, left panel) or electroblotted on nitrocellulose membrane and probed with mouse α -HIS mAb (right panel). Molecular size markers are on the left.

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Supplemental Figure S4



Supplemental Figure S4 NBDHEX reduction by sodium dithionite. Full MS of the untreated NBDHEX (A) or NBDHEX treated with sodium dithionite (C). MS/MS of the ions at m/z 298 and 268 (unmodified and reduced NBDHEX, respectively) give rise to neutral loss of a water molecule generating the ions at m/z 280 and 250, whose further fragmentation (MS3) is shown in panel B and D, respectively.

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Supplemental Figure S5. MS analysis of the in vitro reaction between HIS-gG3PD and NBDHEX.

MS/MS spectra matching the gG3PD peptides (113-120) (A), (859-872) (B), and (456-477) (C) carrying cysteine adducts with a mass increase of 265 Da (A and B) and 281 Da (C). The mass shift +265 Da is compatible with an NBDHEX derived adduct in which the nitro group was reduced to an amine one, while the mass increment of 281 Da matches with an NBHEX adduct in which the nitro group was semi-reduced to an hydroxyamine group. In the peptide (113-120) the unique cysteine residue (Cys133) is involved in the adduct as clearly demonstrated by the fragment pattern detected in the MS/MS spectrum (A). The peptide (859-872) contains two cysteine residues (Cys836 and Cys838) and the adduct is more probably located on the first cysteine residue (B). In the peptide (456-477) there are three candidate cysteine residues at positions 458, 460, and 462: the Cys 458 is most likely the one involved in the adduct formation, but the involvement of the second or the third cysteine cannot be excluded (C).

References

1. Colussi, T., Parsonage, D., Boles, W., Matsuoka, T., Mallett, T.C., Karplus, P.A., *et al.* (2008). Structure of alpha-glycerophosphate oxidase from *Streptococcus* sp.: a template for the mitochondrial alpha-glycerophosphate dehydrogenase. *Biochemistry*. 47, 965-977.

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PART III

1 - *Plasmodium berghei* and *Plasmodium knowlesi* phylogenetic profiling.

As described in Part I, we reconstructed and analyzed *P. falciparum* phylogenetic profiles by using the reference set RS2 and the distance correlation as a measure profile similarity. In order to perform comparative analyses of *Plasmodia* interactomes, we applied the same procedure to construct phylogenetic profiles of *P. knowlesi* and *P. berghei*. These two parasites infect primates (*P. knowlesi*) and rodents (*P. berghei*) and are considered *in vivo* models for human malaria.

Although the genome sequences are available for both the parasites, the status of the gene-annotation is still incomplete making difficult the assessment procedure based on the construction of the gold standard data sets. In fact, information related to the two parasites in KEGG database results in a limited number of TPs, especially in the case of *P. knowlesi*.

Considering that the annotation of *P. falciparum* proteins deeply overcomes that one of other *Plasmodia* species, we exploited *P. falciparum* gold standards to derive the corresponding ones of *P. berghei* and *P. knowlesi*. In order to approach this, we used OrthoMCL database (www.orthomcl.org) where groups of orthologous proteins are collected. On these bases, the process of gold standard construction for these *Plasmodium* was done converting the protein pairs in gold standards of *P. falciparum* into the corresponding pairs of orthologous of *P. berghei* and *P. knowlesi*.

The two sets of gold standards (see Table I for details) were used to assess the predicted interactions by phylogenetic profiling of *Plasmodium* parasites.

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In figure 1 the predictive performances obtained for *P. berghei* (panel A) and *P. knowlesi* (panel B) are shown as ROC curves.

Table I: summary of the numbers of TP and TN obtained for each set of gold standards

	GS-fun		GS-fun_OGS	
	TP	TN	TP	TN
<i>P. berghei</i>	15320	93395	16180	22207
<i>P. knowlesi</i>	1873	4087	16024	23564

In both cases, the best results were obtained by using gold standards derived from *P. falciparum* orthologs (green lines). In particular, in the case of *P.*

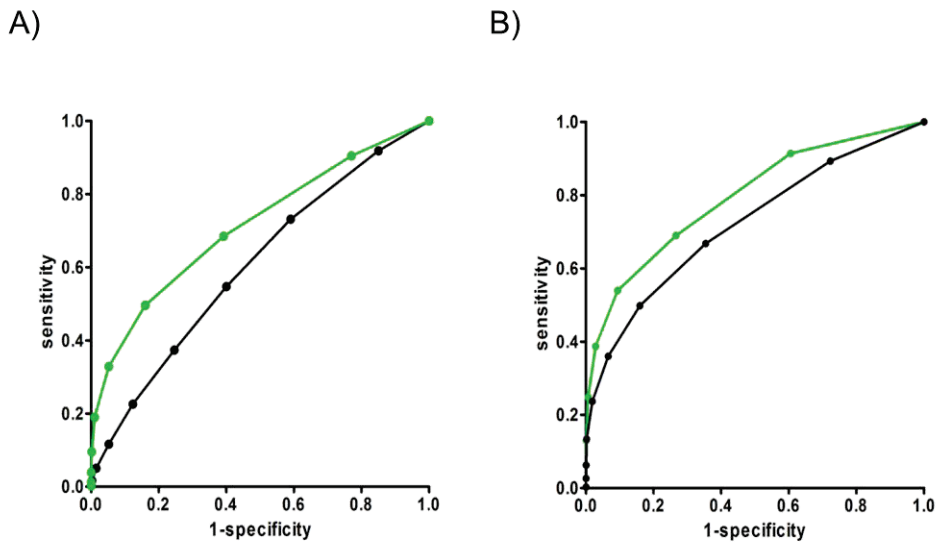


Figure 1. Evaluation of the prediction performances of *P. berghei* and *P. knowlesi* data set using KEGG derived and the gold standards derived from *P. falciparum* ones. *P. berghei* data on panel A, and *P. knowlesi* data on panel B. The best predictive performance is obtained using the gold standards obtained from *P. falciparum* ones (GS-fun_OGS; green lines) in both cases, while the performance assessed by using the GS-fun gets worse results (black lines).

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berghei, the AUC obtained by using these gold standards is equal to 0.712, while the AUC obtained using GS-fun_{pb} is equal to 0.609. For *P. knowlesi*, the AUC obtained using GS-fun_GSO_{pk} is equal to 0.794, while the AUC obtained using GS-fun_{pk} is equal to 0.721.

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2 – Phylogenetic profiling to predict host-parasite interactions in *P. falciparum* and *P. knowlesi*.

In order to look for novel targets of drug or vaccine development, a big challenge in malaria research is to identify the PPI networks taking place between the host and the parasite. However, in the case of the infected erythrocytes, usually used experimental and computational approaches based on the transcriptomic analyses of the host-parasite system under physiological and perturbed conditions are hampered by the absence of the transcriptional activity of the erythrocytes.

Considering that the similarity of the phylogenetic profiles indicates that two interacting proteins need to co-evolve to perform their biological function, we applied the phylogenetic profile strategy to predict “hybrid” PPI networks of the host-parasite system.

We applied this interspecies phylogenetic profile method to the two host-parasite systems: *i*) *P. falciparum* and the human erythrocyte (PfH) and *ii*) *P. knowlesi* and the erythrocyte of its natural host Rhesus monkey (*Macaca mulatta*) (PkM).

In order to approach this, we exploited mass spectrometry data available for the human and monkey erythrocyte proteomes, and then we derived the phylogenetic profiles of the corresponding proteins by using RS2 (Reference Set 2, see paragraph 4.1 in Part I). The distance correlation was adopted to measure the similarity between *Plasmodium-Plasmodium*, *Plasmodium-erythrocyte*, and erythrocyte-erythrocyte phylogenetic profiles.

A threshold of the distance correlation equal to 0.6 was established, resulting in the selection of 2211 proteins (1933 and 278 from the parasite and the host

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respectively) involved in 53937 interactions for the PfH system and 2286 proteins (1509 and 777 from the parasite and the host respectively) with 204966 interactions for the PkM system. In figure 2 the predicted Plasmodium-erythrocyte interactomes are shown, where full nodes are the *Plasmodium* proteins, while red and green nodes represent human and monkey erythrocyte proteins respectively.

Further analyses will be carried out to explore the two PPI networks and to remove FPs due to the trivial connections between orthologs in the two organisms. This should highlight functionally significant host-parasite interactions that will be the object of experimental validations.

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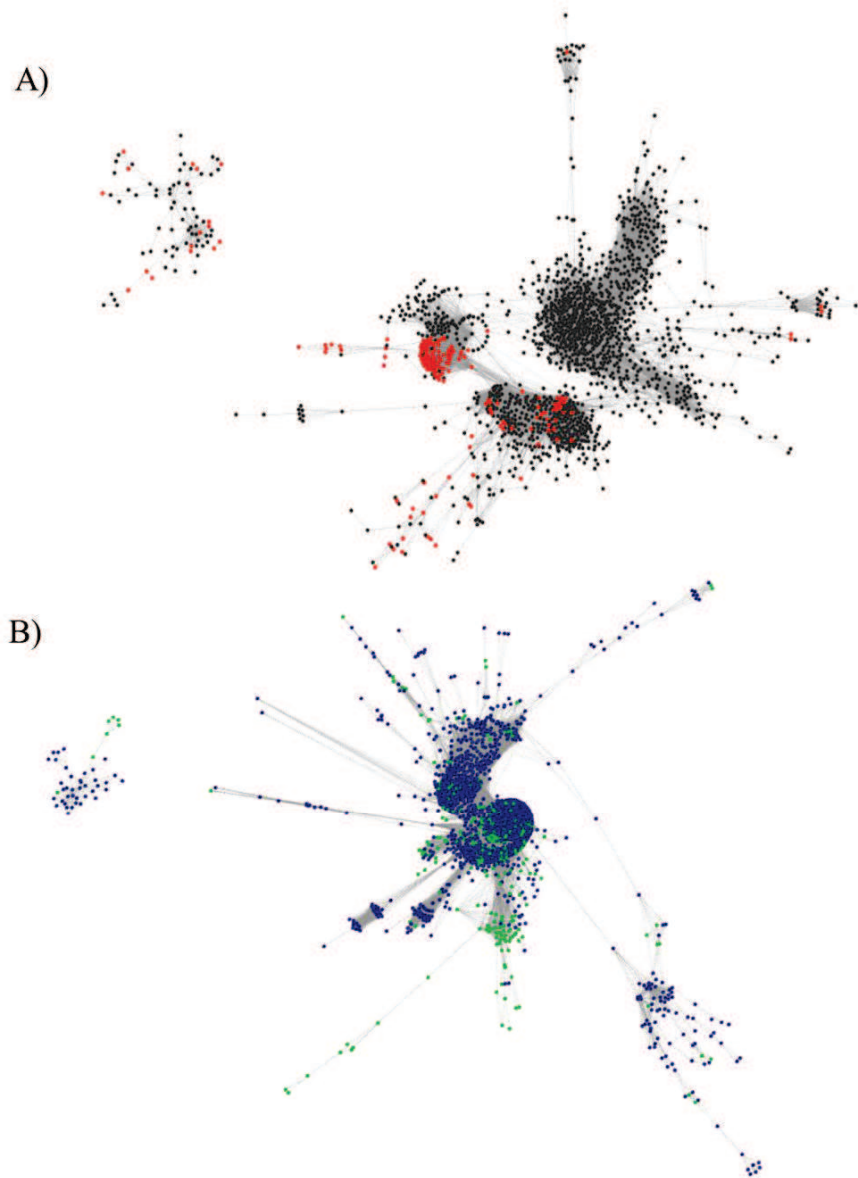


Figure 2. “Hybrid” interactomes of host-parasite systems. A) The main two clusters of the “hybrid” interactome of *P. falciparum* proteins with the human erythrocyte proteins are represented. Black nodes correspond to *P. falciparum* proteins, while red nodes represent the human erythrocyte proteins. The edges are the interactions. **B)** The main two clusters of the “hybrid” interactome of *P. knowlesi* and Rhesus monkey erythrocyte proteins are represented. Blue nodes correspond to *P. knowlesi* proteins, while green nodes represent the erythrocyte proteins of Rhesus monkey.

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3 - A multidomain protein from *Giardia duodenalis*, a rosetta stone case.

Beside the inference of PPIs, the rosetta stone method can be utilized to reconstruct the evolution of gene fusion events exploiting “rosetta-stone proteins” phylogenesis.

In order to explore this approach, we focused on a specific case of study, that is a protein containing a glycerol-3-phosphate dehydrogenase (gG3PD) domain in *Giardia duodenalis*. *G. duodenalis* is a protozoan parasite, which causes giardiasis, the most common feedborne and waterborne human gastroenteric disease (Ryan & Cacciò, 2013; Halliez & Buret, 2013). Both energy and intermediate metabolism of this parasite have been shown to represent potential targets for drug screening and design (Müller and Hemphill, 2013; Watkins and Eckmann 2014). As gG3PD is a key enzyme at the crossroad of glycolysis, redox and fatty acid metabolism, it represents a potential candidate for drug development.

Preliminary BLAST data base searches suggested that gG3PD is formed by three different domains (a, b, c), and thus can be a potential “rosetta stone protein”.

In order to reconstruct its phylogenesis, we developed a specific database search strategy. To avoid any kind of bias possibly introduced by redundancies and/or low quality sequences, we used RS1, the largest, non redundant set among the high quality genome reference sets that we obtained (see paragraph 4.1 in Part I). We then performed five different FASTA searches against the 774 genomes in RS1, using as queries: the entire gG3PD_{abc}, and four virtual peptides, the gG3PD_{ab}, formed by the first two domains (a: 1- 500 aa; b: 501-

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950 aa), and each of the three domains, gG3PD_a, gG3PD_b and gG3PD_c (c: 951-1111 aa).

The Smith-Waterman algorithm, available in the FASTA package (version 36; Pearson & Lipman, 1988), was utilized. A match between sequences was considered positive when the corresponding alignment has a coverage higher than 70%, and an E-value lower than 10^{-6} . In the case of the smallest virtual peptide gG3PD_c, the E-value threshold was set at 10^{-3} .

We selected five groups of protein sequences matching the criteria and investigated the evolutionary relationships within each group.

Results clearly show that gG3PD_a and gG3PD_b are closely related to bacterial G3PD domains and FAD/NAD binding domains respectively. We found only 33 matches between gG3PD_c and bacterial proteins, whose annotations suggest a “metal-binding” function. Interestingly, only one match was obtained for gG3PD_{abc} with a protein from the protozoan *Entamoeba histolytica* that causes intestinal infectious disease in humans and only one match for the gG3PD_{ab} with a protein, from *Eggerthella lenta* that is part of the human colon bacterial flora.

The inspection of the Tree of Life revealed that *E. histolytica* and *G. duodenalis* not only share the same niche in the human host, but they have also a common origin in that they form a single branch in the Protozoa clade.

Altogether, these results provide highlights on the origin of gG3PD as a “rosetta-stone protein”. A possible scenario is the one shown in figure 3, a gene fusion event occurred between gG3PD_a and gG3PD_b in *E. lenta*, then the fused gene was acquired by an eukaryote sharing the same ecological niche in the human intestine and that can be considered as the common ancestor of *E. histolytica* and *G. duodenalis*.

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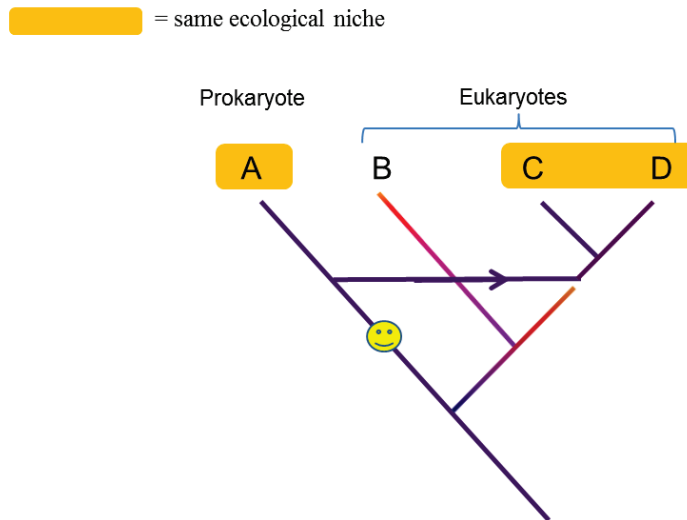


Figure 3. A possible scenario of gG3PD origin. A fusion event (yellow smiling face) took place in a prokaryote (A) followed by a lateral gene transfer to the ancestor of the eukaryotes C and D.