

# The evolution of metabolic profiling in parasitology

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## SUMMARY

The uses of metabolic profiling technologies such as mass spectrometry and nuclear magnetic resonance spectroscopy in parasitology have been multi-faceted. Traditional uses of spectroscopic platforms focused on determining the chemical composition of drugs or natural products used for treatment of parasitic infection. A natural progression of the use of these tools led to the generation of chemical profiles of the parasite in *in vitro* systems, monitoring the response of the parasite to chemotherapeutics, profiling metabolic consequences in the host organism and to deriving host-parasite interactions. With the dawn of the post-genomic era the paradigm in many research areas shifted towards Systems Biology and the integration of biomolecular interactions at the level of the gene, protein and metabolite. Although these technologies have yet to deliver their full potential, metabolic profiling has a key role to play in defining diagnostic or even prognostic metabolic signatures of parasitic infection and in deciphering the molecular mechanisms underpinning the development of parasite-induced pathologies. The strengths and weaknesses of the various spectroscopic technologies and analytical strategies are summarized here with respect to achieving these goals.

**Key words:** Metabolic profiling, host-parasite interactions, spectroscopy, network analysis.

## INTRODUCTION

Parasitological research, although firmly grounded in fieldwork, has benefited from recent advances in analytical technologies applied to profiling biological extracts or samples obtained from the parasite and host organisms. Perturbations in the metabolic composition of tissues, biofluids or cell media can uncover information relating to the concentrations and fluxes of metabolites through pathways that reflect the mechanism of action of a parasite either *in vitro* or in the host environment. High-resolution spectroscopic platforms such as mass spectrometry (MS) and nuclear magnetic resonance (NMR) spectroscopy are particularly suited to generating metabolic fingerprints from complex biological samples. The development of mathematical modelling algorithms and network analysis software for analysing, interpreting and visualising 'omic' data have also contributed to the practical application of metabolic profiling technology to parasite research. A brief summary of the evolution of metabolic profiling in parasitology is given and the relative benefits and limitations of key analytical platforms and data analysis strategies are discussed in relation to the application of metabolomic and metabonomic technology to developing diagnostics, unravelling molecular mechanisms underlying parasitic infection

and to monitoring control and treatment programmes at the individual and population levels.

## TECHNOLOGIES FOR METABOLIC PROFILING

### *Spectroscopic platforms*

A wide variety of spectroscopic and analytical platforms exist with the capacity to generate metabolic profiles directly from biological samples. Key technologies that have found application within parasite research in a diagnostic capacity or in exploring mechanisms of action of particular parasitic species include nuclear magnetic resonance (NMR) spectroscopy, capillary electrophoresis (CE) and various forms of MS with or without chromatographic separation (Fig. 1). Spectroscopy generally involves the measurement of the emission or absorption of energy by matter. An explanation of the theory of the spectroscopic techniques discussed is beyond the scope of this review, but is well-described in many reference works e.g. Grant and Harris (1996) for NMR spectroscopy and Gross and Caprioli (2003) for MS. NMR spectroscopy exploits the magnetic features of certain nuclei with the property of spin and the signals generated from a chemical mixture reflect the local environment of each atom within a molecule. The signal intensity is directly proportional to the concentration of the chemical group detected and the shape and splitting pattern, as well as the position of the signal on the chemical registration scale, all contain information regarding molecular structure. Nuclei that have been applied to

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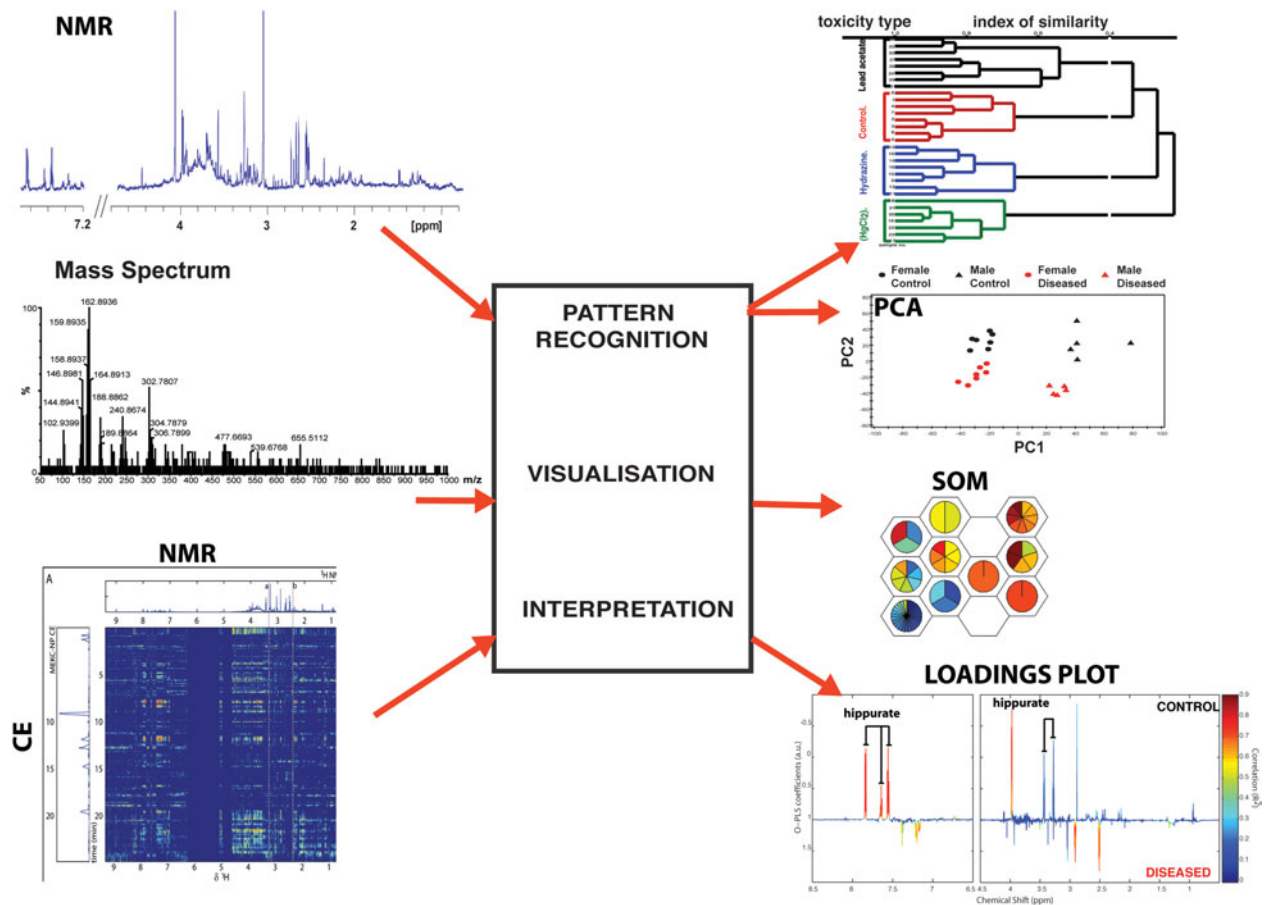


Fig. 1. Schematic showing examples of common spectral inputs and model outputs used in metabolic profiling studies. Different types of spectral data (e.g. NMR, UPLC-MS, CE) are modelled using a range of multivariate techniques, which each have advantages and limitations in terms of characterization of pathology, visualisation of samples and ease of extraction of discriminatory metabolites or potential biomarkers of a particular infection. Self organising mapping is a type of artificial neural network that allows organisation of the data according to a property of interest in a 2-dimensional space. Hierarchical cluster analysis is typically an unsupervised approach to generating a hierarchy of clusters of objects based on a calculated similarity matrix, the shorter the branch length, the more similar the objects are. PLS-DA (Partial Least Squares Discriminant Analysis) uses classification information to maximise the differential between two or more classes of objects and is typically displayed as scores plots (showing the similarity between objects – the nearer two coordinates are, the more similar the spectra) and coefficient plots (indicating the contribution of the variables, or metabolites in differentiating the classes).

measuring parasite or host composition or responses include  $^{31}\text{P}$ ,  $^{13}\text{C}$ ,  $^{15}\text{N}$  and  $^1\text{H}$  with other nuclei such as  $^{19}\text{F}$  being applied to specific studies e.g. characterizing the metabolism of fluorinated chemotherapeutics. Whilst NMR spectroscopy is an excellent analytical tool for molecular structural identification, making identification of biomarkers relatively easy, it lacks sensitivity in comparison with MS technology. Much of the early MS work in parasitology was performed using gas chromatography (GC)-MS, for example determination of parasite glycoconjugates (Ferguson and Homans, 1988; McConville and Blackwell, 1991) or fatty acids and sterols (Weber *et al.* 1994). Databases for metabolite identification have been well developed for GC-MS and it remains one of the most useful platforms in post-genomic

metabolic profiling. Liquid chromatography (LC)-coupled MS systems have also been employed successfully for metabolic profiling, although there are fewer examples of applications in parasitology. Nevertheless, the development of ultra-performance liquid-chromatography (UPLC)-MS systems, using smaller sorbent particle sizes ( $<2\ \mu\text{m}$ ) than conventional HPLC systems, offer significant analytical improvement, being inherently more sensitive, giving a more rapid separation and thereby reducing the total acquisition time and improving sample throughput (Plumb *et al.* 2004). Another emerging MS tool in parasitology is the Orbitrap Fourier transform (FT) platform, which delivers a high accuracy mass, making metabolite identification in biological samples more tractable than other MS profiles. Coupled

with a hydrophilic interaction chromatography (HILIC) column, the rapid elimination of lipids allows a strong profile of metabolites such as the trypanosome-specific trypanothione to be collected (Kamleh *et al.* 2008). Capillary electrophoresis (CE), which operates on separation of molecules on the basis of their charge-to-mass ratio, is also an emerging player in the suite of analytical technologies applied to metabolic profiling. CE has the advantage of being relatively inexpensive to acquire and run but relies heavily on databases for metabolite identification. Nevertheless, the ongoing development of such databases and the coupling of CE to MS should increase the utility of this method in the near future. In a study of profiling urine from mice infected with *Schistosoma mansoni*, CE was found to have a similar capacity to profiling as NMR spectroscopy (Wang *et al.* 2004; García-Pérez *et al.* 2008).

Although various different analytical platforms are utilized for profiling of small molecules, MS methods occupy pole position in proteomic analysis. The complete genome sequences for several parasitic species are now available and there is a drive towards generating proteomic data to match. Whilst traditional proteomic methods relied on the use of two-dimensional gel electrophoresis followed by mass spectrometry or N-terminal sequencing of key proteins on an individual basis, newer mass spec based methods are being developed involving the simultaneous characterization of peptides using high resolution liquid chromatography coupled with tandem mass spectrometry (LC/LC-MS/MS) (Carrucci *et al.* 2002). Coverage of proteomics is beyond the scope of this review but applications include identification of different species and stages of the life cycles of parasites and determination of host-parasite interactions (Cooper and Carucci, 2004; Johnson *et al.* 2004; Liu *et al.* 2009). This body of research should progress the understanding of parasite biology and ultimately lead to identification of new therapeutic or vaccine targets.

#### *Analysis and interpretation of spectral data*

The generation of high density spectral data delivers molecular fingerprints that can be used in a diagnostic or exploratory capacity is the backbone of metabolic profiling. However, these complex data require careful processing and computational analysis in order to extract systematic multiparameter responses. The profiling of multivariate responses over time to characterize a response to a biological stimulus such as infection, genetic modification or therapeutic intervention led to the term metabolomics, developed largely from the NMR spectroscopic research in the 1980s (Nicholson *et al.* 1999). The related field of metabolomics, grounded in the GC-MS community and concerned more with

extensive molecular characterization of biological samples (Fiehn, 2002) was developed in parallel. In order to interpret the complex spectral data, multivariate statistical and mathematical modelling tools were adapted and developed, including methods such as the linear projection methods (Trygg *et al.* 2007) e.g. principal components analysis (PCA) or partial least squares discriminant analysis (PLS-DA), and Bayesian probabilistic methods (Webb-Robertson *et al.* 2009). These mathematical modelling techniques allow characterization, prediction and visualisation of the 'omic' data and also enable rapid detection of outliers or anomalous responses. Superimposed on these primary multivariate methods are a series of data preprocessing and filtering methods. For example, it is generally necessary to align spectral data and to normalise the spectra to an internal or external standard. The metabolic profiling literature is flooded with technical papers describing such methods (e.g. Duran *et al.* 2003; Katajamaa and Oresik, 2005; Chae *et al.* 2008; Vesselkov *et al.* 2009). Other functions used to simplify data interpretation include curve resolution and fitting to 'clean' the spectral profile and diminish background noise (Thysell *et al.* 2007; Richards *et al.* 2008), and orthogonal filtration, to remove parts of the data matrix unrelated to the biological focus. For instance, if the greatest biochemical variation in a host-parasite data set is influenced predominantly by gender or age then the effect of the parasite can be obscured against the background variation. Orthogonal filtration enables subdivision of the spectral matrix into components that vary systematically with parasitic infection and the remaining data relating to other primary sources of variation (Trygg and Wold, 2002). At the other end of the data analysis pyramid is the requirement to display and interpret the data in the wider context of the whole system and to model interactions between the disparate levels of 'omics' data. Here the field of bioinformatics makes a strong contribution (Lacroix *et al.* 2008) and network analysis is currently being liberally applied in parasite-related experiments and models (e.g. Breitling *et al.* 2008; Scheltema *et al.* 2008; Doyle *et al.* 2009; Roberts *et al.* 2009) to provide biological maps of both parasite and host metabolism. It is hoped that the impressive array of technology applied to understanding host-parasite biology will result in generation of new therapeutic targets and development of sustainable control strategies for parasites but requires a firm anchoring in the more practical aspects of parasitology conducted through extensive field work.

#### APPLICATION OF SPECTROSCOPIC TOOLS TO CHEMOTHERAPY

Traditionally NMR spectroscopy was used as a pure structural elucidation tool and one of its

most common uses was to confirm the structure and purity of synthesized drugs. Within parasitology, spectroscopy has been widely applied to characterizing therapeutics from both synthetic and natural product-derived sources. Examples of NMR-characterized chemicals displaying anti-parasitic activity include novel sesquiterpenes, aignopsanoic acid, methyl aignopsanoate and isoaignopsanoic acid from *Cacospongia mycofijiensis* in northern Papua New Guinea, which demonstrated activity against *Trypanosoma brucei* (Johnson *et al.* 2009). Cyclic alkyl polyol derivatives e.g. 4,6,2'-trihydroxy-6-[10'(Z)-heptadecenyl]-1-cyclohexen-2-one isolated from the bark of the *Tapirira guianensis* tree, used in traditional medicine in French Guiana, demonstrated anti-leishmanial, anti-plasmodial and antibacterial properties based on *Staphylococcus aureus*, *Staphylococcus epidermidis* and *Escherichia coli* systems (Roumy *et al.* 2009). Other antiparasitic substances with NMR-confirmed molecular structures include tricyclic guanidine alkaloids extracted from the marine sponge *Monanchora unguifera* with activity against *Plasmodium falciparum* and *Leishmania donovani* (Hua *et al.* 2004) and antimalarial compounds from root bark of *Garcinia polyantha* (Lannang *et al.* 2008).

Mass spectrometry has also occupied a prominent position in the isolation and identification of chemotherapeutic compounds in parasitology. Using GC-MS, the sesquiterpene nerolido was identified as an active constituent of the essential oil obtained from the adult leaves of *Viola surinamensis*, a plant used by the Waiãpi Indians in the Brazilian Amazon to treat malaria. Its activity was related to the inhibition of glycoprotein biosynthesis (Lopes *et al.* 1999). The essential oil of *Hexalobus crispiflorus*, a Cameroonian plant traditionally used as an antimalarial was profiled using GC-MS technology and found to be potent against *Plasmodium falciparum* in culture (Boyom *et al.* 2003). Other examples of elucidation of natural products include assessment of the chemical composition of the volatile essential oil of *Artemisia annua* using two-dimensional GC-ToF-MS (Ma *et al.* 2007) and identification of components of green tea (*Camellia sinensis*) catechins using HPLC with GC-MS with known activity against *Trypanosoma cruzi* (Paveto *et al.* 2004).

An extension of the profiling of natural products and synthesised compounds with antiparasitic properties is to explore structure-metabolism relationships for a series of related compounds. Using both NMR and MS tools to characterize the structures of nine alkaloids isolated from young leaves of *Guatteria dumetorum*, the growth-inhibitory capacity of each compound against *Leishmania mexicana* was determined. Potency was found to be positively associated with a methylenedioxy functionality, particularly at the 1,2-positions (Correa *et al.* 2006). Spectroscopic methods can also be used to determine

molecular structural or behavioural properties such as pK(a) values. One such example was the determination of the PK(a) values for a series of indoloquinoline alkaloids, in view of their antimalarial activities using  $^1\text{H}$  NMR spectroscopy (Grycová *et al.* 2009).

The use of natural products without isolation of the active chemical can lead to a wide discrepancy in the activity or potency of these products related to the high degree of variation in the product which is dependent on a variety of genetic and environmental factors including geographic location, macro- and micro-climate and age of plant etc. Spectroscopic tools have been shown to be capable of detecting differences in plant and animal materials sourced under different physiological and environmental conditions (Robosky *et al.* 2005; Holmes *et al.* 2006). In one such study applied to *Artemisia annua*, a plant with antimalarial activity against multidrug-resistant strains of *Plasmodium falciparum*, clear differences in the metabolic profile of plant extracts from different sources were found using  $^1\text{H}$  NMR spectroscopy. Moreover, the metabolic profiles generated were mathematically modeled and were predictive both of anti-plasmodial activity and of cytotoxicity (Bailey *et al.* 2004). Later  $^1\text{H}$  NMR studies have developed quantitative assays for artemisinin, the key active component of *Artemisia annua*, which is typically present in low concentrations (Castilho *et al.* 2008).

There are several documented instances of counterfeit or impure therapeutics being sold, particularly in developing countries. For instance, there is a high prevalence of counterfeit tablets of the antimalarial artesunate found in southeast Asia. Liquid chromatography coupled with mass spectrometry strategies have been developed to detect 'fake' products containing the wrong active ingredients (Hall *et al.* 2006; Sengaloundeth *et al.* 2009). Similarly in Myanmar, only 7 of 50 samples of a typical 'mixed' medicine product were found to contain curative medicine for malaria as determined via mass and atomic spectroscopy (Newton *et al.* 2008).

The bioavailability and metabolism of drugs can also be easily monitored using spectroscopy. Bioavailability studies have been conducted on mefloquine (*P. falciparum*) in humans employing electron-capture negative-ion chemical ionization GC-MS assay to assess the quantification in plasma following administration of both liquid and tablet forms. The method demonstrated good sensitivity and reproducibility with a mean intra- and inter-day variation of <4.5 and 5.5% respectively (Neal *et al.* 1994). HPLC-MS has similarly been applied to profiling artesunate and its primary active metabolite dihydroartemisinin (Karunajeewa *et al.* 2004). Substantial inter-patient variability was observed and the bioavailability of the second dose relative to the first was found to be 0.72. Similar pharmacokinetic

studies on dihydroartemisinin have also been conducted *via* HPLC-based methods in other populations including Africa and Asia (Mithwani *et al.* 2004). A natural progression from bioavailability and pharmacokinetic studies is to consider metabolism of drugs and therapeutics. Here again spectroscopic tools have a clearly defined role to play in the elucidation of drug metabolites. The metabolism of deoxyartemisinin, a semisynthetic antimalarial with potential for treatment of multiple drug-resistant malaria, was investigated using  $^1\text{H}$  and  $^{13}\text{C}$ -NMR spectroscopy in both microbial and rat model systems. Three microbial metabolites of deoxyartemisinin were identified in the microbial system, and two in the rat plasma, of which one metabolite was the same (Khalifa *et al.* 1995). Another study using  $^{31}\text{P}$  NMR spectroscopy was used to evaluate the activity of anticancer therapeutic 2-deoxyglucose against a filarial infection of *Acanthocheilonema viteae* in a *Mastomys coucha* host (Shukla-Dave *et al.* 2000). An unusually long retention time of 2-deoxyglucose-6-phosphate along with a decrease in ATP levels was recorded.

Spectroscopic tools have also been extensively applied to the evaluation of the mechanism of action of drugs. For example,  $^{19}\text{F}$ , which has the advantage of having almost equal sensitivity to proton but additionally is not contained within endogenous molecules and so generates a 'clean' drug metabolite profile is commonly used in drug metabolism studies. The mechanism of erythrocyte accumulation of mefloquine (San George *et al.* 1984) and the stereochemistry of the carboxylation of phosphoenolpyruvate by *Ascaris* muscle phosphoenolpyruvate carbokinase (Hwang and Novak, 1986) have been investigated using  $^{19}\text{F}$  NMR spectroscopy.  $^{31}\text{P}$  is also an effective nucleus for studying the effects of drugs and therapeutics on living organisms. Although less sensitive than either  $^1\text{H}$  or  $^{19}\text{F}$ ,  $^{31}\text{P}$  profiles provide easy access to energy dependent pathways. Thus, for example,  $^{31}\text{P}$  profiling of the effect of risedronate on *Cryptosporidium parvum* growth was able to demonstrate inhibition of cell growth based on the profiled phosphomonoesters and nucleotide diphosphates (Moreno *et al.* 2001). Energy changes in several host systems in response to various antimalarials have also been shown (Moreno *et al.* 1972; Olsen, 1972).

In addition to investigating drug metabolism and bioavailability, spectroscopic tools can be used to identify and monitor drug toxicity. Mefloquine is an FDA approved drug for the treatment of malaria and is often used in combination with artesunate. However, adverse neurological effects have been associated with this therapeutic. Mass spectrometry was used to profile and quantify plasma mefloquine and was related to endpoints associated with impairment of motor activity and degeneration of brain stem nuclei (Dow *et al.* 2006).

#### PROFILING OF THE BIOCHEMICAL COMPOSITION OF PARASITES AND *IN VITRO* PARASITE SYSTEMS

The biochemical composition and metabolism of several parasites *in vitro* have been studied using NMR profiling techniques. Early metabolic profiling of parasites tended to use  $^{31}\text{P}$  or  $^{15}\text{N}$  nuclei to map metabolic processes related to energy metabolism. For a human filarial (*Brugia malayi*) infection in the host *Mastomys coucha*, detection of parasites was achieved using  $^1\text{H}$  magnetic resonance imaging and related to the composition of metabolites in the parasite and the host as determined *via*  $^{31}\text{P}$  high-resolution spectroscopy (Shukla-Dave *et al.* 1999). GPC, the major phospholipid and PEP, the major energy reservoir were present in high concentrations in *B. malayi*. Sugar phosphates and phosphatemoesters were found to be decreased in the testis of animals infected with the parasite indicating changes in bioenergetics and phospholipids metabolism.  $^{31}\text{P}$  NMR spectroscopy has also been applied in an *in vivo* flow mode whereby viability of the nematode *Steinernema carpocapsae* was maintained by continuous circulation of oxygen in the spectrometer, which enabled the kinetics for the interconversion of phosphoarginine to adenosine triphosphate to be calculated (Thompson *et al.* 1992). A similar  $^{31}\text{P}$ -NMR spectroscopic strategy has been applied to studying the metabolism of intact helminth parasites *Ascaris suum* (intestinal roundworm) and *Fasciola hepatica* (liver fluke) (Rohrer *et al.* 1986). Changes in the concentrations of sugar phosphates but not ATP/ADP were observed. In an extension of this study, the effect of the drug closantel on a *F. hepatica* infection was studied and found to be predominantly characterized by a decrease in glucose 6-phosphate.

One example of the application of  $^{15}\text{N}$  NMR spectroscopy is the study of nitrogen metabolism in *Angiostrongylus cantonensis* eggs where  $^{15}\text{N}$ -aspartic acid was shown to act as an amino group donor for both 2-oxoglutaric-glutamic acid and the pyruvate-alanine transamination systems (Nishina *et al.* 1990).

*Plasmodium falciparum* is one of the most studied parasites. In a  $^1\text{H}$  NMR screen of extracts prepared from the mature trophozoite-stage in parasites isolated by saponin-permeabilisation of the host erythrocyte over 50 metabolites were identified, of which 40 were quantified using four different extraction methods (Teng *et al.* 2009). The major metabolite classes included alpha-amino acids, 4-aminobutyrate, mono-, di- and tri-carboxylic acids polayamines polyols and membrane components such as phosphocholine and phosphoethanolamine.

The metabolism of labeled substrates by parasites has been studied using NMR spectroscopy for several decades. Much of the current understanding of plasmodial metabolism derives from early biochemical studies. More recently techniques such as  $^{13}\text{C}$  NMR spectroscopy have been employed to

elucidate products of glucose metabolism using D-[1-<sup>13</sup>C] glucose (Lian *et al.* 2009). Major metabolites identified in infected erythrocytes e.g. [1,3-<sup>13</sup>C] glycerol and [3-<sup>13</sup>C] glycerol-3-phosphate were not found in uninfected erythrocytes incubated under identical conditions. This confirmed suggestions based on transcriptomic and proteomic studies that energy metabolism in *Plasmodium falciparum* is more complex than originally thought and may represent a metabolic adaptation to growth in O<sub>2</sub>-limited conditions.

The end products of glycolysis of *Leishmania donovani* in both the amastigote and promastigote forms have been studied via <sup>1</sup>H NMR analysis of the media, wherein alanine, succinate and acetate were found to be the key metabolites with lesser quantities of lactate, pyruvate and glycine generated (Castilla *et al.* 1995). Likewise, tissue extracts of perchloric acidocalcisomes – storage organelles for calcium and phosphate were evaluated in *Trypanosoma brucei*, *T. cruzi* and *Leishmania major* using <sup>31</sup>P NMR spectroscopy – high levels of di- tri- tetra- and pentapolyphosphates suggesting they play a critical role in these parasites (Moreno *et al.* 2000). Using advanced metabolic profiling technology involving the coupling of hydrophilic chromatography (HILIC) to Orbitrap Fourier transform mass spectrometry (FT-MS), *in vitro* procyclic forms of *Trypanosoma brucei* were profiled and a range of ‘signature’ molecules of the parasite such as trypanothione and glutathione were detected (Kamleh *et al.* 2008). The relative uptake and metabolism of different substrates can also be efficiently modelled. In a study investigating the metabolism of *Trypanosoma brucei* in an *in vitro* system, L-proline metabolism in the glucose rich and glucose depleted medium was investigated using <sup>13</sup>C NMR spectroscopy and showed that trypanosomes can adapt their energy production pathways in response to carbon source availability (Coustou *et al.* 2008).

#### PROFILING OF THE HOST METABOLIC STATUS

In order to understand parasite biology, and to identify potential targets for infection control, it is advantageous to understand not only the biology of the parasite, but also that of the host or hosts. Therefore, much effort has been expended in metabolically defining various host systems. Here again spectroscopic tools have a valuable role to play. Studies have been conducted purely to characterize the metabolic status of host species, with particular attention being paid to mosquito vectors of malaria and dengue. For example, a MS-based study was performed on the mitochondria of *Anopheles stephensi* to profile metabolic pathways that may have relevance to understanding ageing and response to insecticides in this species (Giulivi *et al.* 2008). The proline pathway in this mosquito species differed

from mammalian mitochondrial metabolism in that oxoglutarate was catabolised by either the tri-carboxylic acid cycle or transamination depending on ATP requirement.

Early pilot studies applied NMR and MS technology to elucidating the response of the host to various parasitic infections. Such studies include a <sup>1</sup>H NMR analysis of the metabolite profile in human serum in patients with malaria (Nishina *et al.* 1988) and <sup>1</sup>H and <sup>31</sup>P NMR studies on blood from murine systems experimentally infected with malaria (Deslauriers *et al.* 1982; 1985). In another study exploring the effect of a *Plasmodium berghei* infection in a rodent model, T<sub>1</sub> and T<sub>2</sub> relaxation properties were used to explore the changes in liver triglycerides, which were further modified in fasted animals (Deslauriers *et al.* 1988). A more detailed characterization of the triglyceride content of the liver was achieved using a targeted GC assay wherein both malaria-infected and fasted mice showed a four-fold increase in phospholipids content.

In *Mesocestoides vogae*-infected mice, the infected livers had higher concentrations of glycine, choline species, alanine and lactate than controls and lower concentrations of glucose at both 24 and 133 days post-infection (Blackburn *et al.* 1993). Additionally, at day 133 those animals with a heavy infection showed evidence of higher concentrations of succinate and taurine with lower levels of acetate than controls.

More recent studies have set out to explore the effect of parasitic infection of specific host pathways. The effect of *Trichinella spiralis* infection on the cerebral pyruvate recycling pathway was investigated in the mouse using <sup>13</sup>C-labelled acetate as a substrate detected by <sup>13</sup>C-NMR (Nishina *et al.* 2004). The consequences of the parasitic infection on energy metabolism were also investigated in parallel using <sup>31</sup>P-NMR spectroscopy. The study showed that *T. spiralis* infection induced hypoglycaemia in the host but that cerebral levels of ATP remained unaffected. A combination of <sup>1</sup>H-NMR and <sup>31</sup>P-NMR were applied to generate metabolic profiles of *Echinococcus multilocularis* cysts grown subcutaneously and intraperitoneally in *Meriones unguiculatus* (Novak *et al.* 1992). The cysts grown in the abdominal cavity were found to contain lower concentrations of glucose and phosphocreatine but more succinate, acetate, alanine and 3-D-hydroxybutyrate than subcutaneous cysts. A similar study used D-(1-<sup>13</sup>C)glucose with <sup>13</sup>C NMR monitoring to investigate metabolism in *Hymenolepis diminuta*-infected and uninfected *Tenebrio molitor* beetles (Schoen *et al.* 1996). Infected beetles contained less glycerophosphocholine and more glycogen than controls. In addition to glucose, labelled trehalose, alanine, succinate and lactate were detected. Complementary *in vitro* experiments suggested that the trehalose was of parasite and not beetle origin.

Metabolic profiling methods can be used in either a hypothesis generating mode, where a broad screen is undertaken with no prerequisite for selection of molecular analytes, or in a hypothesis testing mode whereby a particular molecular pathway or class is selected for targeted analysis. Modulation of the tryptophan and kynurenine pathways have been implicated in cerebral malaria. A HPLC-GC-MS-MS method was applied to brain extracts from mouse models of cerebral and non-cerebral malaria to detect metabolites of the kynurenine pathway (Sanni *et al.* 1998). Kynurenine and quinolinic acid were increased in both cerebral and non-cerebral models of malaria but increased at an earlier stage post-infection in the cerebral malaria model.

Several metabolic profiling studies have focused on elucidating the molecular profiles of intermediate vectors or hosts such as mosquitos or snails. An exemplar study is that of Kittayapong and colleagues who compared a vector and a non-vector strain of *Anopheles* mosquito using GC analysis of cuticular lipids. The GC chromatograms of n-hexane extracts showed no qualitative differences between strains but did manifest quantitative differences in the concentration of 5 compounds belonging to saturated and unsaturated free fatty acids and n-alkanes (Kittayapong *et al.* 1990). Another study of intermediate hosts involved the application of  $^{31}\text{P}$  NMR to characterize the metabolic profile of the digestive gland-gonad complex (DGG) of *Biomphalaria galbrata*, a vector for *Schistosoma mansoni* (Thompson and Lee, 1987). The *in vivo* spectrum was dominated by phosphatides, carbamoyl phosphate, sphingomyelin, phosphonate, nucleotide di- and triphosphate, uridine diphosphoglucose, ceramide, sugar phosphates, phosphoryl choline and glycerophosphoryl choline. Infection induced a reduction in the levels of phosphonate, phospholipids and carbamoyl phosphate. In addition to the direct effects of infection, indirect effects can also be studied. Thus, the metabolic effects of starvation of *B. galbrata* snails were also assessed. Here a similar decrease in phosphonate was observed but none of the other infection-associated changes (Thompson and Lee, 1986). In another study by Thompson *et al.* *in vivo*  $^{31}\text{P}$  NMR was used to explore the difference between *S. mansoni* infected and non-infected *Biomphalaria galbrata* snails. The foot of the infected snails had a lower phosphoarginine to adenosine triphosphate than non-infected snails (Thompson *et al.* 1993).

A major development in metabolic profiling technology is the use of advanced mathematical modelling methods for analysis and interpretation of spectroscopic data. Computer-based pattern recognition algorithms have been applied to various host-parasite systems and initial studies were mainly concerned with the characterization of the metabolic response of the host to parasitic infection, as manifested in biofluid samples (e.g. urine, serum, faeces),

in order to explore the potential of the analytical technologies as diagnostic platforms. Both  $^1\text{H}$  NMR spectroscopy (Wang *et al.* 2004) and capillary electrophoresis (CE) (Garcia-Perez *et al.* 2008; Angulo *et al.* 2009) have been coupled to multivariate statistical analysis methods to characterise a *Schistosoma mansoni* infection in a murine host system. The two profiling methods overlap in the subset of molecules detected but additionally generate a unique subset making the two technologies complementary in terms of their diagnostic capacity. Both technologies detected *Schistosoma*-induced perturbation of energy metabolism (e.g. decreased urinary citrate excretion), gut microbial metabolism and liver metabolism as evidenced by decreased hippurate concentrations and increased phenylacetyl glycine, amongst other metabolites. In addition to the core set of metabolic perturbations CE identified urate, urea and isocitrate, whereas compounds such as trimethylamine and 2-oxoisocaproate were unique to the NMR fingerprints. In an extension of this initial study, the metabolic response of several other hosts to helminthic and protozoan infections were characterized, including *Schistosoma japonicum* in hamster urine and serum (Wang *et al.* 2006) and *Echinostoma caproni* in the mouse (Saric *et al.* 2008).

#### IDENTIFICATION OF HOST-PARASITE INTERACTIONS AT THE MOLECULAR LEVEL

Since metabolic profiling methods can be applied to both host and parasite systems independently, an obvious step is to integrate the metabolic knowledge from both systems and to probe host-parasite interactions. High resolution electrospray mass spectrometry can also be used to achieve targeted analysis of molecules of interest. In one such study, a small heat-stable chromophore extracted from mosquitoes, that was implicated as the signal that induces mating of *Plasmodium* was identified as xanthurenic acid, a metabolite in the tryptophan pathway (Garcia *et al.* 1998). This metabolite was found to activate gametogenesis of *P. falciparum* and *P. gallinaceum* *in vitro*.

The co-evolution of host and parasite has resulted in the development of several biological strategies for co-existence. In a study where HPLC coupled to electrochemical detection and GC-MS. The composition of *Ascaris suum* was investigated and was found to contain the opiate alkaloid morphine, which was also found in the medium of the *in vitro* system. Since *Ascaris* does not express the opiate receptor, it was assumed that the function of the opiate synthesis and excretion related to the microenvironment rather than to the parasite (Gouman *et al.* 2000).

For obvious reasons relating to prevalence and severity, malaria is the most widely studied human parasitic disease and this is reflected also in the metabolic profiling literature, with cerebral malaria

being of particular interest. Some of the recent advances in malaria diagnostics have been described in a review article by Hawkes and Kain (2007). The metabolic effects of malarial infection have been studied in a range of animal models and in man. Early NMR experiments using labelled substrates have also been employed to monitor differences in metabolism in malaria-infected hosts. Using [2-<sup>13</sup>C]pyruvate as a labelled substrate, the gluconeogenic activity was compared in perfused livers of mice with and without a *P. berghei* infection by <sup>13</sup>C NMR spectroscopy (Geoffrien *et al.* 1985). <sup>13</sup>C labelling of glucose occurred in positions 1, 2, 5 and 6 regardless of infection but the degree of <sup>13</sup>C labelling in glucose carbons was reduced in livers from malaria-infected animals indicating a reduced rate of hepatic gluconeogenesis. The flux of metabolites through the erythrocyte in anaerobic glycolysis has also been measured using <sup>13</sup>C NMR. Glucose flux was shown to be several fold higher in human erythrocytes infected with *Plasmodium falciparum* and was proportional to the parasitaemia (Mehta *et al.* 2005).

One metabolic profiling study showed that for a *Plasmodium berghei* ANKA infection in a mouse strain resistant to cerebral malaria, brain dysfunction was still observed using magnetic resonance imaging (Penet *et al.* 2007). The aetiology of the brain dysfunction was assigned to secondary effects of anaemia and liver damage and was associated with abnormal brain choline profiles and perturbed glutamine, myo-inositol, glycine and alanine concentrations, thought to relate to hepatic encephalopathy.

Alterations in the levels of low molecular weight metabolites and cytokine expression have been reported, in addition to blood cell sequestration, as part of the human response to cerebral malaria. Multinuclear NMR spectroscopy has been used to profile brain tissue from a mouse model of cerebral malaria in comparison with three cytokine knockout strains (TNF(-/-); susceptible to cerebral malaria and IFN $\gamma$ (-/-) and LT $\alpha$ (-/-); resistant to cerebral malaria). The TNF(-/-) and wild-type susceptible strains manifested decreased utilisation of glucose, high-energy phosphates and tricarboxylic acid cycle intermediates although the levels of parasitaemia were comparable (Parekh *et al.* 2006). The increased glutamine and decreased phosphorylation potential in the susceptible mice implicates the immune response to the pathogenic metabolic alterations associated with cerebral malaria.

For many parasites, the host response relies on the phase of the parasite's developmental cycle. In a recent study a MS-based metabolomic approach was used to investigate the effect of *Plasmodium falciparum* in various phases of the intraerythrocyte developmental cycle (Olszewski *et al.* 2009). Some metabolites were modulated throughout all the

phases whilst others were phase specific. The main finding of this study was the conversion of extra-cellular arginine to ornithine by the parasite, which may suggest that systemic arginine depletion plays a role in malarial hypoargininaemia associated with human cerebral malaria. The global metabolic response of *P. berghei* in NMRI mice has been investigated using <sup>1</sup>H NMR spectroscopic profiling of biofluids (Li *et al.* 2008) and indicated a parasite-induced up-regulation of glycolysis and a generalised increase in energy demand (increased plasma lactate and pyruvate with decreased glucose, creatine and glycerophosphocholine). The urine profile of *P. berghei* infected mice identified increased pipercolic acid as a marker and additionally uncovered alterations in a range of gut microbial metabolites and co-metabolites including methylamines and phenylacetyl-glycine.

Diagnostic biomarkers of parasitic infection can sometimes be used to monitor response to intervention. The effect of therapeutic interventions on host-parasite metabolism have been profiled using various spectroscopic technologies. Following the administration of dichloroacetate, an activator of pyruvate dehydrogenase, to mice with murine cerebral malaria, 40% of the animals survived the normally lethal infection of *Plasmodium berghei* ANKA (Rae *et al.* 2000). NMR spectroscopy was used to show that dichloroacetate reduced brain levels of lactate and alanine and increased those of glutamine.

#### PRACTICAL SPECTROSCOPY AND TOWARDS SYSTEMS BIOLOGY

The application of post-genomic technologies (transcriptomics, proteomics, lipidomics and metabolomics) in parasitology has opened many avenues for deepening our understanding of parasite biology and of host-parasite interactions across the distinct bio-organisational levels in the host organism, and can aid in the identification of new drug targets and control strategies, or even provide a means of monitoring response to therapeutic intervention at the individual and population level. However, in terms of the applicability of these post-genomic technologies as diagnostic tools in developing countries, installation and operation of the analytical equipment required is expensive and often impractical. Therefore, in metabolomics, as for the other post-genomic disciplines, the major advantage lies in improving mechanistic knowledge of host-parasite interactions or in identifying panels of biomarkers that are specific to a given species of parasite and which can be transformed into a simple biochemical assay – ideally a dip stick or by using some of the newer lab-on-a-chip technology (Domschke *et al.* 2006). There is however, an obvious role for metabolic profiling technology in the diagnostic arena. Although spectroscopic equipment is in general



expensive and requires highly trained personnel for its operation, there may be scope for implementation of some of the less expensive platforms, for instance some of the basic HPLC-MS or CE platforms in key laboratories in developing countries. Tools such as high resolution NMR spectrometry and FT-MS can be used to optimise the recovery of biomarkers of infection, which can then be translated to less expensive technology. For example, the unique molecular structural elucidation properties of NMR spectroscopy can be applied to the analysis of easily accessible biofluids in well-defined laboratory host-parasite models to identify key signals in CE profiles (Angulo *et al.* 2009). Many of the commonly used diagnostics of parasitic infection are fairly crude and involve the detection and quantification of parasites or their eggs in faeces or blood. These techniques, although practical and robust, often lack sensitivity and are time- and labour-intensive. Another major issue in developing countries is that multi-parasitism tends to be the norm rather than the exception (Guignard *et al.* 2000; Raso *et al.* 2006; Steinman *et al.* 2008) and thus a diagnostic, which can identify multiple species of infection simultaneously is highly desirable. Initial NMR and MS based screening of human populations to develop diagnostics for various parasite strains proved difficult due to the complexity of human metabolism, which is influenced by a vast number of genetic and environmental factors with infinite capacity for interaction (Singer *et al.* 2007). This promoted the strategy for returning to laboratory-based host-parasite models and defining panels of biomarkers for a series of mono-infected host-parasite systems (Li *et al.* 2008, 2009; Wang *et al.* 2008; Saric *et al.* 2009). More recently, these laboratory studies have been extended to investigate models of co-infection with the ultimate aim of developing a diagnostic tool that accommodates the complexity of human populations. Although the complexity of human metabolic profiles can be daunting, conversely it is this very complexity and variability that offers huge potential in understanding pathological processes at the systems level. Not only does the metabolic signature of urine or serum provide information on the presence of infection, but can also contain parallel information on the nutritional status of an individual, genetic background and information regarding co-morbidities.

Thus, these metabolic signatures hold the key to being able to understand an individual's response or even predisposition to parasitic invasion and promote interpretation of response at the systems level. In tandem with rapid development of the analytical technologies for profiling genes, proteins and metabolites, new mathematical methods have been developed for analysis of such high density data and strategies for the systematic integration of 'omic' data may soon be able to achieve a significant leap forward in our understanding of human systems.

Systematic integration of 'omics' data and application of network modelling tools will provide the optimal overview of the global biological status of an organism. Several new methods of visualising and co-analysing metabolic networks deriving from both the parasite and the host are being developed allowing a clearer picture of the pathological process and highlighting many new candidates for drug targets (Breitling *et al.* 2006, 2008; Jourdan *et al.* 2008). Molecular screening tools hold promise for population screening initiatives and will deliver a holistic read-out on the health of an individual incorporating information of the presence of infection, the nutritional status and even the response of an individual to therapeutic intervention. There is some preliminary evidence derived from pilot studies that, based on the metabolic phenotype of an individual, their response to drug metabolism can be predicted (Clayton *et al.* 2009).

The prospect of being able to conduct global metabolic screening in the developing world and to understand more fully the equilibrium between host and parasite is an exciting and achievable goal. By judicious integration of 'omic' technologies with mathematical modelling and bioinformatics tools, we should be able to translate new mechanistic knowledge into practical solutions to control and treatment of parasitic infections and to combat developing drug resistance.

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