1 Metabolic changes of the host-pathogen environment in a

2 Cryptosporidium infection

- 4 Running title: Metabolism of Cryptosporidium infections
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Abstract

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Cryptosporidium is an important gut microbe whose contributions towards infant and immunocompromise patient mortality rates are steadily increasing. Current techniques for diagnosing, curing or simply understanding the biology of the parasite are few and far between. relying on a combination of in-silico predictions modelled on a varied and unique group of organisms and medical reports. The development of an *in-vitro* culture system, using COLO-680N cells, has provided the *Cryptosporidium* community with the opportunity to expand its toolkit for investigating this disease. One area in particular that is sorely overlooked is the metabolic alterations upon infection. Existing research is extremely limited and has already shown that significant variation can be found between the metabolome of different infected host species. Using a ¹H Nuclear Magnetic Resonance approach to metabolomics, we have explored the nature of the mouse gut metabolome as well as providing the first insight into the metabolome of an infected cell line. Through a combination of Partial Least Squares Discriminant Analysis and predictive modelling, we exhibit new and potentially game changing insights into the effects of a Cryptosporidium parvum infection, while verifying the presence of known metabolic changes. Of particular note is the potential contribution of host derived taurine to the diuretic aspects of the disease previously attributed to a solely parasite based alteration of the gut environment. This practical and informative approach can spearhead our understanding of the Cryptosporidium-host metabolic exchange and thus provide novel targets for tackling this deadly parasite.

Introduction

Cryptosporidiosis is a disease characterised by prolonged episodes of intense diarrhoea and is the second largest cause of diarrhoeal disease and death in infants across Africa and South Asia (Checkley et al. 2014, Kotloff et al. 2013, Striepen 2013, Wanyiri et al. 2014). It is also amongst one of the highest medically important diseases of the immunocompromised, especially HIV positive patients who are at 75-100% risk of contracting the disease depending on the geographical area (Shirley et al. 2012, Wanyiri et al 2014). The pathogens responsible are parasites belonging to the apicomplexans, the Cryptosporidium species, of which C. parvum is typically the more likely (Caccio 2005, Leoni et al. 2006, Widmer and Sullivan 2012, Wielinga et al. 2008). Infection occurs when an individual ingests the oocysts of the parasite, often swallowing a contaminated water source. Water treatment options are limited to filtering, which is generally not possible at an industrial scale and UV treatment, which is both expensive and rarely available prior to the outbreak. Failing this, treatment is typically rehydration, although one drug has been shown to be effective, the broad spectrum anti-parasitic Nitazoxanide (Doumbo et al. 1997). However, the drug is far from ideal and displays a range of undesirable side effects including cytotoxicity and nausea, as well as being limited to use in cases where the patients are immunocompetent (Domjahn et al. 2014, Hussien et al. 2013, Manjunatha et al. 2016, Sparks et al. 2015).

Until recently, a significant barrier to research into cryptosporidiosis has been the absence of a combined long-term *in vivo* culturing system and comprehensive model of host parasite interactions in addition to a heavy reliance on antibody based detection both in the scientific and the medical field (Briggs et al. 2014, Checkley et al. 2014, Domjahn et al. 2014, Girouard et al. 2006, Karanis and Aldeyarbi 2011, Leitch and He 2012, Muller and Hemphill 2013, Striepen 2013). Recent papers have attempted to rectify this by proposing improved or entirely novel techniques for culturing the parasite *ex-vivo* in tissue cultures, using the cultured cancer

- cells as host cells (Morada et al. 2016, Muller and Hemphill 2013). A recent study identified
- 81 that infections of COLO-680N cell cultures produced a longer term and higher production
- volume culture of the parasite compared to previously existing *in-vitro* cultures (Miller et al.
- 83 2017). These advances have allowed higher in depth microscopy-based studies and even
- promise to provide a solution to developing a genetic engineering platform for the parasite.
- However, beyond microscopy and localisation studies, the knowledgebase of the host parasite
- interaction remains largely undeveloped (Manjunatha, et al. 2015, Sponseller et al. 2014,
- 87 Striepen 2013, Wilhelm and Yarovinsky 2014).
- One area lacking study is metabolomics. Only two peer-reviewed publications have explored
- the concept of the infection metabolome, one on mice and the other on human faecal samples,
- 90 both showing a clear relation between infection and change in metabolite levels (Ng Hublin et
- al. 2013, Ng Hublin et al. 2012). While working on different sample sources, each identified
- 92 the hexadecanoic acid as a significant contributor to the change in the metabolome during
- 93 infection. Previous studies noticed a number of metabolites, mainly amino acids, decreased in
- 94 relative abundance in infected mice faeces compared to an increase seen previously in humans
- 95 (Ng Hublin et al. 2012). This was explained to be most likely due to the inherent variation
- between the different host species metabolomes, as highlighted by Saric et al. in 2008 and
- 97 highlights a pressing need for further and wider reaching studies into the metabolome of
- 98 *Cryptosporidium* infections as well as the development and application of different techniques
- 99 beyond the Gas Chromatography Mass Spectrometry (GC-MS) used in those papers (Ng
- 100 Hublin et al. 2013, 2012, Saric et al. 2008).
- ¹H Nuclear Magnetic Resonance (NMR) metabolomics is a powerful alternative to GC-MS for
- metabolic screening. ¹H NMR is a simpler method that allows for a comparatively lossless
- analysis of metabolites, with fewer steps between sample recovery and analysis (Bezabeh et al.
- 2009, Hong et al. 2010, Jacobs et al. 2008, Saric, et al. 2008, Wu et al. 2010). This translates
- to a more reliable result in terms of quantification and reproducibility. As such, NMR has
- already seen use in analysing the profile of *Plasmodium falciparum*, although the metabolome
- of the apicomplexan parasite as a whole is almost entirely unexplored (Sengupta et al. 2016). Here, we show a novel method of analysing cryptosporidiosis-induced changes in infected mice
- guts metabolomes, using a ¹H NMR approach. In addition, we have applied the same NMR
- based methodology to the *in vitro* infected COLO-680N cell cultures, in order to explore the
- similarities and differences displayed between *in-vivo* and *in-vitro* models and identify
- potential cross-species markers of infection.

Materials and Methods

115 Cryptosporidium

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- Three isolates of *C. parvum* were used in this study. The reference strain *C. parvum* Iowa II
- was obtained from Bunch Grass Farm in the United States, isolated from infected calves. The
- human isolate *C. parvum* Weru strain was supplied courtesy of Dr Martin Kváč of the Institute
- of Parasitology Biology Centre CAS, Czech Republic. The Weru strain was originally isolated
- from an infected human patient and subsequently maintained by passing through SCID mice.
- The final isolate used was the human isolate of *C. hominis*, supplied courtesy of Prof. Rachel
- 122 Chalmers from the *Cryptosporidium* Reference Unit, Singleton Hospital of NHS Wales.
- 123 Tissue culture

- 124 75 cm² monolayers of COLO-680N were infected and maintained as per the protocols outlined
- in Miller et al. 2016, using all three isolates of Cryptosporidium. A control group was also
- established, following the same protocols as the infections, absent oocysts.
- 127 Animals and infection
- For this study, seven day old BALB/c mice were infected at the Institute of Parasitology,
- Biology Centre CAS using pre-established protocols detailed in Meloni and Thompson,
- totalling three mice per condition (Meloni and Thompson 1996). Three separate groups were
- used, one infected with 100,000 oocysts of C. parvum Iowa II, another group was infected with
- 132 100,000 oocysts of the *C. parvum* Weru isolate and the final group were given a PBS control.
- The groups were kept physically spate and never allowed to interact. Infection was monitored
- from Day-1 post-infection by aniline-carbol-methyl violet staining of faecal smears staining
- of faecal smears, in addition to an antigen based strip test (Milacek and Vitovec 1985),
- 136 RIDA®QUICK Cryptosporidium, supplied by R-Biopharm. At ten days post-infection, the
- mice were euthanized by cervical dislocation and decapitation. This study was carried out in
- accordance with Act No 246/1992 Coll. of the Czech Republic. The protocol was approved by
- the Committee for Animal Welfare of Biology Centre Czech Academy of Science and the
- veterinary administration authorities with regards to the animal experiments.
- 141 Sample preparation for NMR
- Animal samples were retrieved from the contents of the ileum and surrounding intestinal
- structure by dissecting out the area of interest and washing through with three ml 100% ethanol
- at room temperature via syringe inserted into the opening, collecting the wash through.
- 145 Collected samples were then centrifuged for three minutes at 10,000 g, the supernatant
- discarded and the pellet weights recorded. The samples were then suspended by vortex in two
- 147 ml of 75 % ethanol then transferred to a new tube and an additional five ml of 75% ethanol
- 148 added.
- 149 Two ml of two mm diameter glass beads were added to the samples and agitated by vortex for
- 30 seconds before incubating the samples for three minutes at 80°C. The samples were vortexed
- for a further 30 seconds or until the sample was completely homogenised. Tissue culture
- samples were collected by draining the media, adding six ml of ethanol at 80°C to the culture
- 153 flask and scraping the cells off the surface by cell scraper, decanting the mixture of lysed cells
- into 15 ml polyethylene tubes.
- The samples were then decanted into two ml tubes, retaining the glass beads in the falcon tubes.
- The beads were washed with an additional two ml of 80°C, 75% ethanol and again the liquid
- was decanted into sterile two ml tubes, retaining the glass beads in the tube.
- 158 Cell debris and general detritus were removed from the samples by centrifugation at 16,000 g
- for 10 minutes and the supernatant transferred to new, sterile two ml microcentrifuge tubes.
- 160 The samples were then dried via Rotorvac overnight at 40°C, suspended in 330 µl double
- distilled water and centrifuged at 2,500 g for 10 minutes. The supernatant for the samples were
- recombined into a single 1.5 ml microcentrifuge tube per original samples and frozen at -20 °C
- until the day before NMR analysis. Twenty-four hours prior to analysis, the sample tubes were
- placed into a freeze drier until completely desiccated. For NMR analysis, the samples were
- suspended in one ml of deuterated water and spiked with the sodium salt of the calibration
- 166 control compound 3-(Trimethylsilyl)-1-propanesulfonic acid (DSS) to a final concentration of
- 167 20 mM and a tested pH of 7.5.
- 168 NMR protocol and analysis

- Samples were analysed using a 4-channel Bruker Avance III 14.1 T NMR spectrometer (600
- 170 MHz ¹H) equipped with a 5 mm QCI-F cryoprobe. For controls: six separate, uninfected 25
- 171 cm² COLO-680N 100% confluent monolayer cultures were analysed in addition to three
- uninfected BALB/c mice. Infected samples consisted of six 25 cm² COLO-680N 100%
- 173 confluent monolayers in addition to three Iowa infected BALB/c and three Weru infected
- BALB/c mice. One dimension NMR datasets were acquired with a pulse repetition rate of 5 s
- over 128 scans, preceded by eight equilibrating dummy scans and suppression of the residual
- Deuterium Oxide solvent (HDO) resonance using presaturation. Processed NMR
- spectrographic datasets were produced by Topspin 3.2 and analysed using Chenomx NMR
- Suite version 8.2. Partial Least Squares Discriminant Analysis (PLS-DA) of the Chenomx data
- were generated with the freely available Microsoft Excel Add-in "multi-base 2015" by
- Numerical Dynamics, Japan (Mutlibase for Microsoft Excel 2015). Pathway predictions were
- produced by the MetaboAnalyst 3.0 web tool, using a hypergeometric test and relative-
- betweeness centrality against *Homo sapiens* and *Mus musculus* databases for the tissue culture
- and mouse models respectively (Xia et al. 2015).
- 184 Indirect Fluorescence Assays
- 185 COLO-680N cultures were seeded onto Lab-Tek, two well, Permanox chamber slides (Sigma
- Aldrich, Cat No. Z734640) and allowed to reach 70% confluence before infecting, following
- previously published protocols (Miller et al. 2017). At seven days post infection the media was
- aspirated from the cultures and washed twice with 1 x PBS. Fresh, pre-warmed RPMI-1640
- 189 (Sigma Aldrich, Cat. No R8758) (1% Antibiotic/Antimycotic) containing 200 nM
- 190 Thermofisher Mitotracker Red CMXRos (Molecular probes; Cat. No M7512), was added to
- the wells and incubated in the dark at 37°C for 45 minutes. The media was removed and
- replaced with further pre-warmed RPMI-1640 (1% Antibiotic/Antimycotic), containing 3.5%
- formaldehyde, for 15 minutes at 37°C as per the manufacturer's protocol. The cells were then
- briefly permeabilised with 0.2% Triton-x100 in 1x PBS for 10 minutes, washed twice with 1x
- 195 PBS and four drops of SporoGloTM or Crypt-a-gloTM (WATERBORNE, INC) added, with
- incubation at 37°C for a further 45 minutes. The final sample was then washed three times with
- 197 PBS, dried and FluoroshieldTM with DAPI (Sigma Aldrich, Cat. No F6057) was added before
- applying a glass coverslip and sealing. Slides were visualised by fluorescence microscopy
- using an Olympus IX82 or Zeiss Elyra P1 confocal microscope.
- 200 Electron microscopy images
- 201 Aclar disks of tissue culture were infected and prepared for EM according to the protocols
- detailed in Miller et al. 2017.
- 203 Ethics

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- All animals involved in the experiments were treated and cared for by trained members of staff
- according to the standards set out by Directive 2010/63/EU regarding Legislation for the
- 206 protection of animals used for scientific purposes.
 - Results
- 210 Mice faecal sample extractions

- 211 Faecal samples from infected and uninfected mice were monitored using aniline-carbol-methyl
- violet staining (Figure 1) to determine validity of the control and progress of infection.
- 213 Samples from both control and infected mice were taken at ten days post infection.
- 214 The spectra produced by the NMR showed clear distinctions between the infected and
- uninfected mice, as well as distinctions between the different strains of infections (Figure 2a).
- Several metabolites were readily distinguishable prior to the metabolomics analyses, including
- 217 indicators of phosphorylation; creatine and creatine phosphate (Figure 2b), taurine (Figure
- 218 2c) and lactate (Figure 2d). Processing the data from the mice guts (n=9) via the Chenomx
- Nmr Suite version 8.2 platform produced a list of 151 compounds that were extrapolated from
- the spectra (Figure 3). Statistical analysis of the data, with freely available Microsoft Excel
- 221 Add-in "multi-base 2015", by Partial Least Squares Discriminant Analysis (PLS-DA)
- determined significant separation of the three conditions, (uninfected control, *C. parvum* Iowa
- 223 II and C. parvum Weru infections), whilst maintaining group cohesion (Figure 4a). The
- loading values of the variable compound contributions (**Figure 4b**), suggest certain metabolites
- were more significant to the separation of the groups than others. The presence of L-alanine
- and valine, two common amino acids, agrees with the previous literature and 2-oxoisocaproate
- is a component of the valine/leucine/isoleucine biosynthetic pathways reports (Ng Hublin et al.
- 228 2013, Ng Hublin et al. 2012).
- MetaboAnalyst 3.0 based analysis of the metabolites proposed that a number of amino acid
- biosynthesis pathways could be altered during the course of an infection, such as the glycine,
- valine and taurine pathways. In addition, the mice infections displayed possible changes to
- other metabolic pathways (Figure 5a) as those pathways furthest from the x, y axis intercept,
- representing both the overall completeness of the pathways and number of contributing
- detected metabolites respectively. The pathways identified in the manner, and the compounds
- discovered by the NMR demonstrated that infections caused changes in at least the valine
- 236 (Figure 5c), glycine (Figure 5d) and taurine amino (Figure 5e) acid biosynthetic pathways, in
- addition to several sugar pathways (**Figure 5b, f, g**).
- 238 *Cell culture sample extractions*
- Extrapolated NMR data from COLO-680N (n=18) metabolite extractions, demonstrated clear
- 240 differences between the each strain and species of *Cryptosporidium* used (**Figure 6**). As with
- 241 the mice samples, differences between creatine, creatine phosphate, taurine and lactate
- 242 (Figures 6b-d) were readily visible in the raw spectra. Chenomx analysis produced a list of
- 243 161 total compounds of varying concentrations across samples (Figure 7). The PLS-DA
- generated by the same statistical analysis as before, produced ample separation of the
- 245 Cryptosporidium-infected and uninfected cultures, (Figure 8a). Furthermore, the separation of
- 246 the individual infection groups suggests that differences between both *Cryptosporidium* species
- and within individual strains of *C. parvum*, may illicit different metabolic responses in cell
- cultures. The loading scores plot of the PLS-DA showed a number of amino acids contributed
- 249 heavily to the separations, as well lactate, several fatty acid derivatives and taurine (Figure
- 250 **8b**).
- 251 Metabolic pathway fitting via MetaboAnalyst 3.0 revealed that amino-acid biosynthesis
- pathways for glycine, alanine and arginine were influenced by infection. These were in addition
- 253 to taurine, pantothenate and CoA biosynthetic pathways as shown in Figure 9a. As with
- Figures 5a-g, the graph shows a combination of how much of a pathway is completed by data
- 255 from the NMR, as well as simply how many metabolites were detected. Among other pathways,
- perhaps the most significant detections were glycine (**Figure 9b**), taurine (**Figure 9c**) alanine

- 257 (Figure 9d) and arginine (Figure 9g) amino acid pathways as well as, potentially the synthesis
- and degradation of ketones (Figure 9e) and pantothenate and CoA biosynthesis (Figure 9f).
- 259 Comparison of mice faecal and COLO-680N metabolome changes
- MetaboAnalyst data from Figure 5 and Figure 9, demonstrate that a number of altered
- pathways are shared between the mice and tissue culture metabolites, particularly taurine and
- amino acid metabolic pathways. Taurine is involved in a number of roles, including bile acid
- 263 conjugation, osmoregulation, membrane integrity and protection against oxidative free
- radicals. Glycine synthesis was also shown to be affected to a large degree and is involved with
- numerous and diverse cellular functions including purine synthesis, basic protein construction
- and provides the building blocks for porphyrins (Denis and Daignan-Fornier 1998, Marver et
- al. 1966). All of these pathways have a direct or indirect impact on the host's mitochondrial
- 268 energetic activity.
- To investigate the cellular role of host mitochondria during infection, we employed an Indirect
- 270 Fluorescence Assay (IFA) approach to determine if the mitochondria of the host cells were
- 271 responding to *Cryptosporidium* infection (**Figure 10**). Our results demonstrate that on multiple
- occasions, the host mitochondria were shown to congregate in larger densities near the
- 273 Cryptosporidium infection (Figures 10). Transmission Electron Microscopy images of
- 274 infected cells also show abnormal host's mitochondrial congregation around the
- parasitophorous vacuole (**Figure 11**).

Discussion

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- Solution-state ¹H NMR offers a novel approach to metabolomics that is especially useful where
- sample volume sizes are particularly small (Jacobs et al 2008, Novak et al. 2006, Wu, et al.
- 280 2010). Although GC-MS holds an advantage for detecting low-levels of metabolites with
- unique mass signatures, for the purpose of determining the change in metabolite quantities,
- NMR provides a viable alternative (Bezabeh et al. 2010, Jacobs et al 2008, Saric et al. 2008,
- Sengupta et al. 2016, Wu et al 2010). Initial analysis of our data showed a clear distinction
- between the metabolic fingerprints of infected and uninfected samples, even between infections
- of different strains of the parasite (**Figure 4**).
- Of particular importance is the degree to which these results, both from the *in-vitro* and *in-vivo*,
- agree with the previous literature. Our study also demonstrates that metabolic compounds L-
- alanine, isoleucine and succinic acid (succinate) were detected as contributors to the variance
- between the sample conditions that indicated infection. Moreover, even though valine was not
- detected in the uninfected controls, it was visible in the infected samples and in agreement with
- previous reports (Ng Hublin et al. 2013, Ng Hublin et al. 2012).
- The predictive fits of the metabolic pathways highlighted a remarkable selection of pathways
- including several involved in amino acid biosynthesis, sugar metabolism, CoA biosynthesis
- and taurine biosynthesis. Of the predicted metabolic pathways, which have been previously
- shown to be influenced by infection, there are several whose presence should have been
- 296 projected, such as the amino acid biosynthesis pathways for alanine and glycine as the previous
- reports had already highlighted their potential involvement reports (Ng Hublin et al. 2013, Ng
- 298 Hublin et al. 2012).
- 299 As a parasite, Cryptosporidium is dependent on host derived biosynthetic pathways for
- survival. For example, C. parvum is incapable of producing the majority of amino acids de-
- 301 novo, instead relying heavily on the import of host metabolites via active channelling

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(Abrahamsen et al. 2004). The biosynthetic pathway for glycine, threonine and serine was upregulated, in both cell culture and animal experimentations, with particularly high levels of glycine detected. Both *C. parvum* and *C. hominis* are incapable of manufacturing these amino acids *de novo*, instead relying on scavenging host serine and glycine, utilising serine and glycine hydroxymethyltransferases to convert one to the other when needed (Abrahamsen et al. 2004, Doyle et al. 1998). The reliance on host amino acids could provide a novel method for combating the infection, based upon previous studies that identified other amino acid metabolic chains as potential targets (Clark 1999, Doyle et al. 1998). For example, glycine reuptake inhibitors (GRIs) that are often used in treating schizophrenia, could be utilised to partially starve the parasite of the metabolite.

In addition to the amino acid biosynthesis pathways, it is also apparent that taurine synthesis is also implicated in the metabolic profile of the disease as shown in the presented analyses; taurine has frequently been used in the past as an agent for inducing excystation for in-vitro cultures as sodium taurochloate (Feng et al. 2006, Gold et al. 2001, Kar et al. 2011, King et al. 2012). In the host, taurine has a number of roles, those relevant to the cell types involved include: cell membrane integrity, osmoregulation and adipose tissue regulation. Previous metabolomic studies of faecal samples from Cryptosporidium-infected patients revealed increased taurine concentrations, explained by the characteristic decline in gut absorption as a result of villi malformation by the parasite (Goodgame et al. 1995, Kapembwa et al. 1990). However, an even greater increase in taurine levels was observed in the infected COLO-680N cell cultures, wherein malabsorption is not an applicable explanation. In addition to the pathways and the relevant metabolites featured in Figures 5 and 9, there were also a number of potentially important metabolites not represented. Similarly observed, was an increase in the abundance of adenosine derivatives (AMP, ADP and ATP); all showed increased abundance in infected cells and mice in C. parvum Iowa II infections, along with a similar increase in creatine levels in C. parvum Weru infections. This heavily implicates a role for the host mitochondria in the context of infection as each species and strain used lacks the creatine kinase needed to produce creatine phosphate, which typically operate in localisation with mitochondria. Levels of pyruvate in C. hominis cell and pantothenate in C. parvum Iowa II infections suggest a role for oxidatative phosphorylation. This is of particular interest as it has been established that the C. parvum genome contains a sequence for a potential pantothenate scavenging protein (Augagneur et al. 2013). Moreover, the further increase in lactate levels detected in C. hominis cell cultures and C. parvum Iowa II mouse infected samples, compared to the controls, indicate a strong contribution from anaerobic pathways most likely from the host. This suggests that more ATP is being produced than the oxidative capacity of the host mitochondria can maintain, producing a net increase in lactate as the oxygen debt increases. This holds particular interest as a theory of *Cryptosporidium's* targets of parasitism include ATP production pathways, similarly to the intracellular rhizarian *Mikrocytos mackini* (Burki et al. 2013).

These data suggest that *C. parvum* and *C. hominis* infections may be directly or indirectly inducing an increase in host mitochondrial activity. If factual, this would result in a large number of oxygen free radicals being produced by the metabolic machinery. Consequently, cell(s) would respond with a matching increase in the synthesis of antioxidants such as taurine, which also sees increases during infection (Giris et al. 2008, Green et al. 1991, Zhang et al. 2004). Support for this hypothesis can be seen in the way host mitochondria appear to congregate around the *Cryptosporidium* infection (e.g. parasitophorous vacuole) (**Figures 10** and **11**). Nevertheless, taurine also plays another role within cells, for example as a diuretic. Taurine is involved in the maintenance of the ionised forms of magnesium and potassium within the cell, producing a diuretic effect that may contribute towards the characteristic water-

- loss of a patient with cryptosporidiosis (Kapembwa et al. 1990, Lin et al. 2016, Niggli et al.
- 1982, Yu et al. 2016). Furthermore, it has been found that taurine levels influence production
- of short chained fatty acid, another aspect of host biology theorised to be scavenged by C.
- parvum and C. hominis (Guo et al. 2016, Seeber and Soldati-Favre 2010, Yu et. 2016). The
- detection of a rise in taurine levels *in-vitro* further suggest that the increase in taurine typically
- detected in cryptosporidiosis patients' stool, is more than simply the result of the guts decrease
- in absorptive qualities. It is likely that the intra-cellular role of taurine in this disease has been
- overlooked and that the pathophysiology of this disease is more complicated than currently
- understood, and extends beyond simple villi degradation.
- Lastly, these results alone provide a promising method of determining infections via a possible
- 361 comparative ¹H NMR of patient and reference biopsies. This method offers an alternative
- approach in the medical field, where current methods of diagnosis are reliant on separate
- methods to achieve the same result as NMR, with infections detected by laborious and often
- inaccurate microscopy and strain typing dependant on successful PCR.
- In conclusion, we have demonstrated for the first time that the use of ¹H NMR in the context
- of both medical and scientific applications is indispensable in the fight against
- 367 cryptosporidiosis. With the application of a more user-friendly and reproducible approach of
- metabolomics, through the ¹H NMR methodology described in this paper, it will now be easier
- 369 for the *Cryptosporidium* community to further explore the remaining aspects of the disease
- 370 metabolome in patients' samples. Future experiments would be best approached by increasing
- 371 the number of strains analysed both *in-vitro* and *in-vivo* to test the relevant proposed
- 372 hypotheses. Additionally, elucidating the more pathogenic influences of taurine biosynthesis
- in the pathobiology of cryptosporidiosis is critical. With these data, a metabolomics based
- method of diagnosing and treating the disease could become a reality.

376 Abbreviations

- 377 NMR: Nuclear Magnetic Resonance
- 378 DSS: 3-(Trimethylsilyl)-1-propanesulfonic acid, sodium salt
- 379 PCA: Principal component analysis
- 380 PLS-DA: Partial Least Squares Discriminant Analysis
- 381 UV: Ultraviolet
- 382 HIV: Human Immunodeficiency Virus
- 383 GC-MS: Gas Chromatography-Mass Spectrometry
- 384 HDO: Deuterium Oxide
- 385 IFA: Indirect Fluorescence Assay
- 386 PCR: Polymerase Chain Reaction
- 387 DAPI: 4',6-diamidino-2-phenylindole
- 388 PBS: Phosphate-buffered saline
- 389 EM: Electron microscopy
- 390 SCID: Severe Combined Immunodeficiency Disease

- 391 ATP: adenosine triphosphate
- 392 AMP: adenosine monophosphate
- 393 ADP: adenosine diphosphate
- 394 CoA: Coenzyme A
- 395 GRIs: glycine reuptake inhibitors

Declarations

- 399 The authors have declared that the research was conducted in the absence of any commercial
- or financial relationships that could be construed as a potential conflict of interest
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571 Figure legends

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Figure 1: Staining of *Cryptosporidium* in faecal samples

- Aniline-carbol-methyl violet stain of a faecal smear taken from a mouse in the infection group.
- The abundant presence of *Cryptosporidium* (arrows) indicates that the infection has been
- successful; and that the animal is producing oocysts.

Figure 2: NMR Spectra of mice models of infection

- a. Stacked NMR Spectra produced from faecal samples of the control mice (green), or either
- the Iowa II (blue) or Weru (purple) groups. **b.** Direct comparisons of the spectra revealed

- several clearly identifiably differences, including differences in creatine and creatine phosphate
- levels. **c.** Levels of taurine were substantially lower in the control or *C. parvum* Weru samples
- compared to C. parvum Iowa II. d. Lactate levels were also much higher in C. parvum Iowa II
- infected mice compared to the barely detectable levels in the control mice or *C. parvum* Weru
- infected groups.

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Figure 3: Mice Experiment Metabolites

- All the metabolites identified by ¹H NMR analysis in infected and uninfected mice were
- 588 explored via PLS-DA statistical analysis. The colour coded heat map represents the
- significance to which each individual metabolite contributed to the identity of the sample
- 590 groups, with more significant contributors tending towards green and less reliable contributors
- 591 tending towards red.

Figure 4: PLS-DA and loading plot of mice model NMR results

- **a.** PLS-DA statistical analysis of the information provided by the Chenomx screening produced
- clear groupings, separating the controls (green), *C. parvum* Iowa II infections (blue) and *C.*
- 596 parvum Weru infections (purple). As the grouping areas, indicated by the areas highlighted, do
- no overlap, it can be said that the separation between the infection conditions represent clear
- differences in the metabolome, which correspond to the *C. parvum* strain. **b.** The loading biplot of the PLS-DA analysis shows many of the compounds identified by Chenomx contributed
- towards the separation and groupings. Those on the outer most edges, for example alanine,
- sarcosine, lactate and lactulose, had some of the greatest influence on the amount of separation
- as determined by the PLS-DA.

Figure 5: Metabolic pathways detected in mouse model NMR samples

- **a.** Data analysed by MetaboAnalyst 3.0, utilising all compounds which displayed some degree
- of change as a result of infection, produced a graph of pathways most heavily impacted (x axis) and pathways containing the most amount of the given compounds (pathway impact: y-axis),
- with statistical significance of the predicted pathways increasing as the colour ranges from
- yellow (low) to red (high). Six pathways were chosen to be of particular interest by their
- position on the graph, with metabolites present in the experimental samples highlighted in red,
- 611 including: **b.** pentose and glucoronate interconversions, valine, **c.** leucine and isoleucine
- 612 biosynthesis, d. glycine serine and threonine metabolism, e. taurine and hypotaurine
- metabolism, **f.** galactose metabolism and **g.** starch and sucrose metabolism.

Figure 6: Cell Culture infection NMR spectra

- a. Stacked NMR Spectra produced from the COLO-680N control cultures (green), or either the
- 617 C. parvum Iowa II (blue), C. parvum Weru (purple), or C. hominis groups. Direct comparisons
- of the spectra revealed several clearly identifiably differences, including, again, differences in
- creatine and creatine phosphate (b.), taurine (c.) and lactate (d.) levels. Noticeably, taurine
- levels were almost undetectable in *C. hominis* or *C. parvum* Weru infections.

Figure 7: COLO-680N Experiment Metabolites

- All the metabolites identified by 1H NMR analysis in infected and uninfected cells were explored via PLS-DA statistical analysis. The colour coded heat map represents the
- significance to which each individual metabolite contributed to the identity of the sample
- groups, with more significant contributors tending towards green and less reliable contributors
- 627 tending towards red.

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Figure 8: PLS-DA and loading plot of COLO-680N - infected cells NMR results

- **a.** PLS-DA statistical analysis of the information provided by the Chenomx screening produced
- clear groupings, separating the controls (green), C. parvum Iowa II infections (blue), C. parvum
- Weru infections (purple) and *C. hominis* infections (red). As the grouping areas do no overlap
- the separation between the infection conditions again indicates that metabolome differences
- can be at least in part explained by different *Cryptosporidium* strains/species. **b.** The loading
- biplot of the PLS-DA analysis shows lactate as a significant contributor to variation, as seen
- before in **Figure 2b**, in addition to taurine and myo-inositol among others.

Figure 9: Metabolic pathways detected in cell cultures' NMR samples

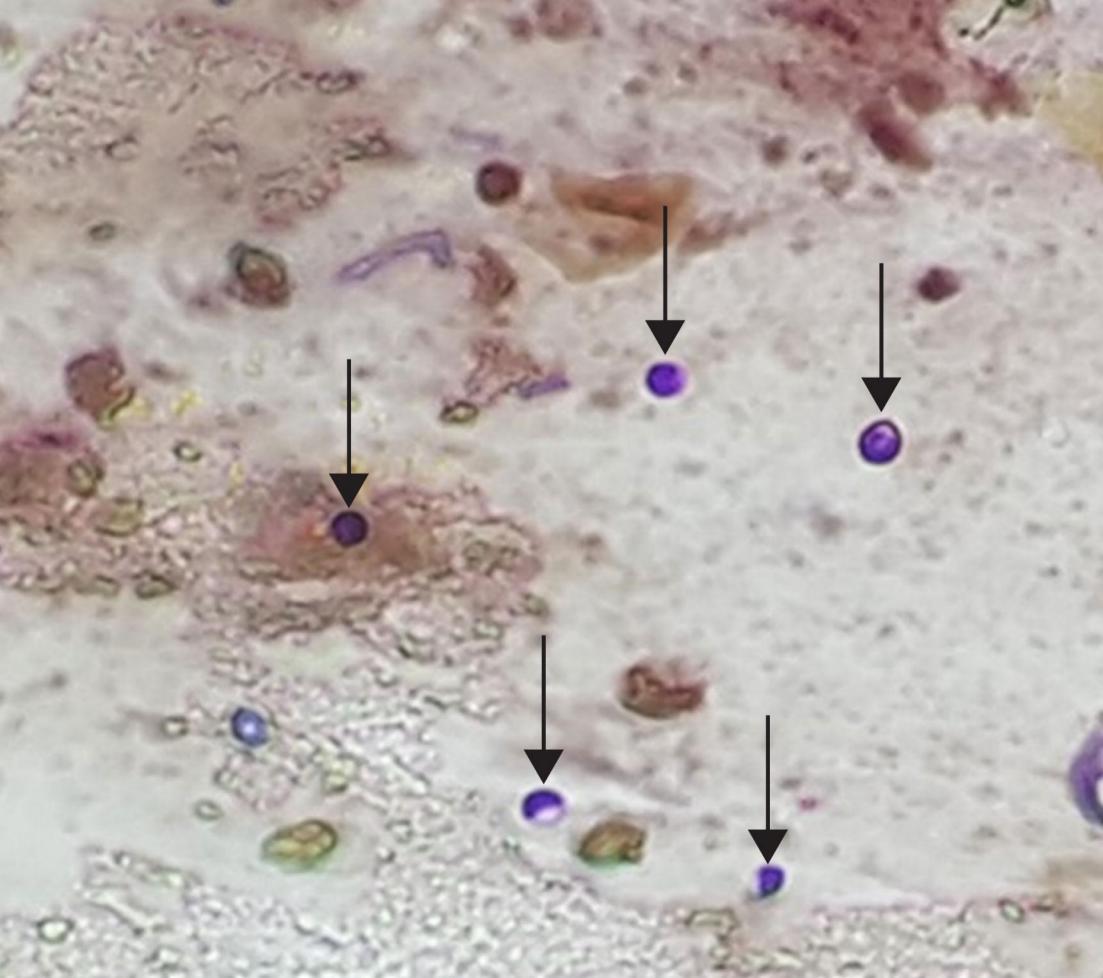
a. Data analysed by MetaboAnalyst 3.0, utilising all compounds which displayed some degree of change as a result of infection, produced a graph of pathways most heavily impacted (x axis) and pathways containing the most amount of the given compounds (pathway impact: y-axis), with statistical significance of the predicted pathways increasing as the colour ranges from yellow (low) to red (high). Six pathways were chosen to be of particular interest by their position on the graph, with metabolites present in the experimental samples highlighted in red, including: glycine, serine and threonine metabolism (**b.**), taurine and hypotaurine metabolism (**c.**), Alanine, aspartate and glutamate metabolism (**d.**), synthesis and degradation of ketones (**e.**), pantothenate and CoA biosynthesis (**f.**) and arginine and proline metabolism (**g.**).

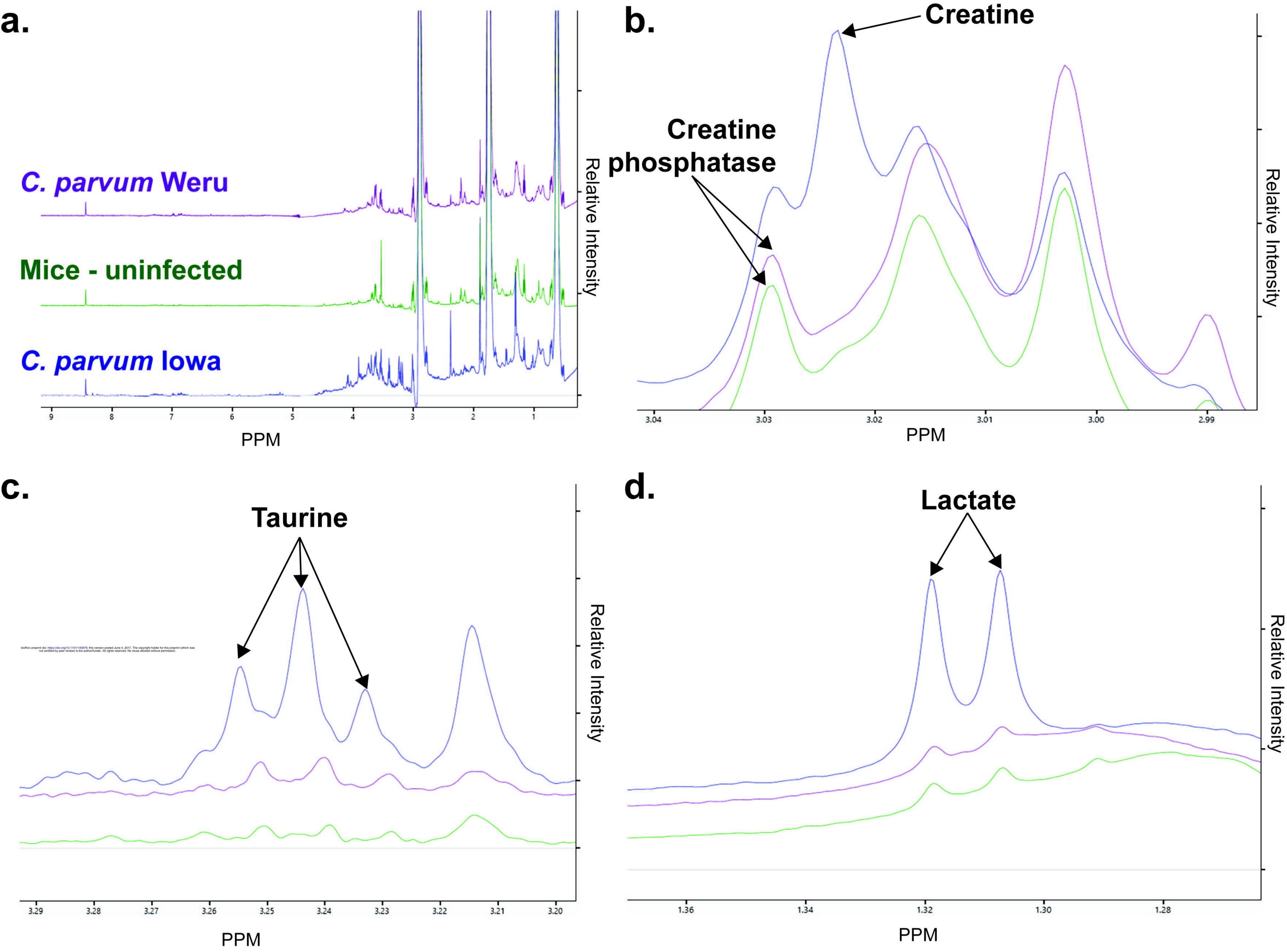
Figure 10: Indirect Fluorescence Assay of infected cell cultures

a. Fluorescence microscopy showing the staining of infected COLO-680N culture with Sporoglo (green), MitoTracker CMXRos (red) and DAPI nuclear stain (blue). From the figure we could observe an obvious mitochondrial "clumping" and polarisation towards areas of infection, suggesting that the presence of the parasite within a host cell affects the positioning of host mitochondria. **b**. Confocal microscopy showing the localisation of Crypt-a-glo (green), MitoTracker (red) and DAPI (blue) in a 3D rendering of 31 individual, 0.16 µm thick sections, overlapping with a final representative thickness of 4.8 µm. The images are rotated around the x-axis, from 0° to 80°, showing a COLO-680N cell infected with C. parvum (green). Individual images of the stainings were captured in different angles, to show the infection on a threedimensional level. A whole video showing a 360° rotation of the three-dimensional z-stack of the image is found as an animation in Video 1. c. Confocal microscopy showing the localisation of Crypt-a-glo (green), MitoTracker (red) and DAPI (blue) in a 3D rendering of 55 individual, 0.16 µm thick sections, overlapping with a final representative thickness of 8.6 µm. The images are rotated around the x-axis, from 0° to 80° , showing a COLO-680N cell infected with C. parvum (green). Individual images of the stainings were captured in different angles, to show the infection on a three-dimensional level. A whole video showing a 360° rotation of the threedimensional z-stack of the image is found as an animation in **Video 2**. **d**. Confocal microscopy showing the localisation of Crypt-a-glo (green) and MitoTracker (red) in a 3D rendering of 51 individual, 0.16 μ m thick sections, overlapping with a final representative thickness of 8.0 μ m. The images are rotated around the x-axis, from 0° to 70°, showing mitochondria surrounding an intracellular stage of with *C. parvum* (green). Individual images of the stainings were captured in different angles, to show the infection on a three-dimensional level. A whole video showing a 360° rotation of the three-dimensional z-stack of the image is found as an animation in **Video 3**.

Figure 11: Electron microscopy of *Cryptosporidum* infected host cells.

a. Infection of a host cell by *C. parvum*. Mitochondria of the host cell appear to closely associate with the parasitophorous vacuole surrounding the parasite, while cytoskeletal structures appear to be associated with the organelles. **b.** Cartoon of image a. demonstrating the presence of mitochondria, cytoskeleton, nuclear material and *Cryptosporidium*.





	<u></u>	Mouse Mouse Iowa Weru		Mouse Control	Mouse Iowa	Mouse Weru		Mouse Mouse Mouse Control Iowa Weru			Mouse Control	Mouse Iowa	Mouse Weru		Mouse I Control	Mouse Iowa	Mouse Weru	
1,3-Diaminopropane			Acetoacetate				Dimethylamine			Leucine				Pantothenate				Key:
1,3-Dihydroxyacetone			Acetoin				Erythritol			Levulinate				Phenylacetate				
1,3-Dimethylurate			Acetone				Ethanol			Malonate				Pimelate				
1,6-Anhydro-β-D- glucose			Alanine				Ethylene glycol			Maltose				Pyroglutamate				
1,7-Dimethylxanthine			Allantoin				Formate			Mannitol				Ribose				
2-Aminoadipate			Alloisoleucine				Fucose			Methanol				Sarcosine				
2-Hydroxy-3- methylvalerate			Anserine				Galactarate			Methylamine				Succinate				
2-Hydroxybutyrate			Arabinitol				Galactitol			Methylguanidine				Succinylacetone				
bioRxiv preprint doi: https://doi.org/10.1101/1 2-Hydroxylsocaproate	45979; this version poste the author/funder. All righ	ed June 4, 2017. The copyright holder for nts reserved. No reuse allowed without pe	erthis preprint (which was ermission. Arabinose				Glucarate			N,N-Dimethylformamide				Sucrose				
2-Hydroxyisovalerate			Ascorbate				Glucitol			N,N-Dimethylglycine				Syringate				
2-Hydroxyvalerate			Asparagine				Gluconate			N-Acetylaspartate				Tartrate				
2-Oxocaproate			Aspartate				Glucose			N-Acetylglutamate				Taurine				
2-Oxoisocaproate			Azelate			,	Glucose-6- phosphate			N-Acetylglutamine				Theophylline				
2-Phosphoglycerate			Betaine				Glutamate			N-Acetylglycine				Threonine				
3-Aminoisobutyrate			Butanone				Glycerate			N-Acetylornithine				Thymidine				
3-Hydromuconate			Caffeine				Glycerol			N-Acetyltyrosine				Thymine				
3-Hydroxy-3- methylglutarate			Caprate				Glycine			N-Carbamoylaspartate				Thymol				
3-Hydroxyisovalerate			Carnitine				Glycocholate			N-Isovaleroylglycine		104		Tiglylglycine				
3-Hydroxymandelate			Cellobiose				Glycolate			N-Methylhydantoin				Trehalose				
3-Methyladipate			Chlorogenate				Glycylproline			N-Nitrosodimethylamine				Trimethylamine				
3-Methylxanthine			Cholate				Guanidinosuccina e			N- Phenylacetylphenylalanine				Trimethylamine N-oxide				
3-Phenylpropionate			Choline				Guanidoacetate			N6-Acetyllysine				UDP-N-Acetylglucosamine	÷			
4-Carboxyglutamate			Citraconate				Homoserine			NADH				UDP-glucose				
5,6-Dihydrothymine			Citrate				Ibuprofen			NADPH				Urea				
5-Aminolevulinate			Creatine				Isocitrate			Nα-Acetyllysine				Valine				
5-Hydroxyindole-3- acetate			Creatine phosphate				Isoleucine			O-Acetylcholine				Xylitol			· ·	
5-Hydroxylysine			Creatinine				Isopropanol			O-Phosphocholine				Xylose				
Acetamide			Cystathionine			-	Lactate			O-Phosphoethanolamine				dTTP				
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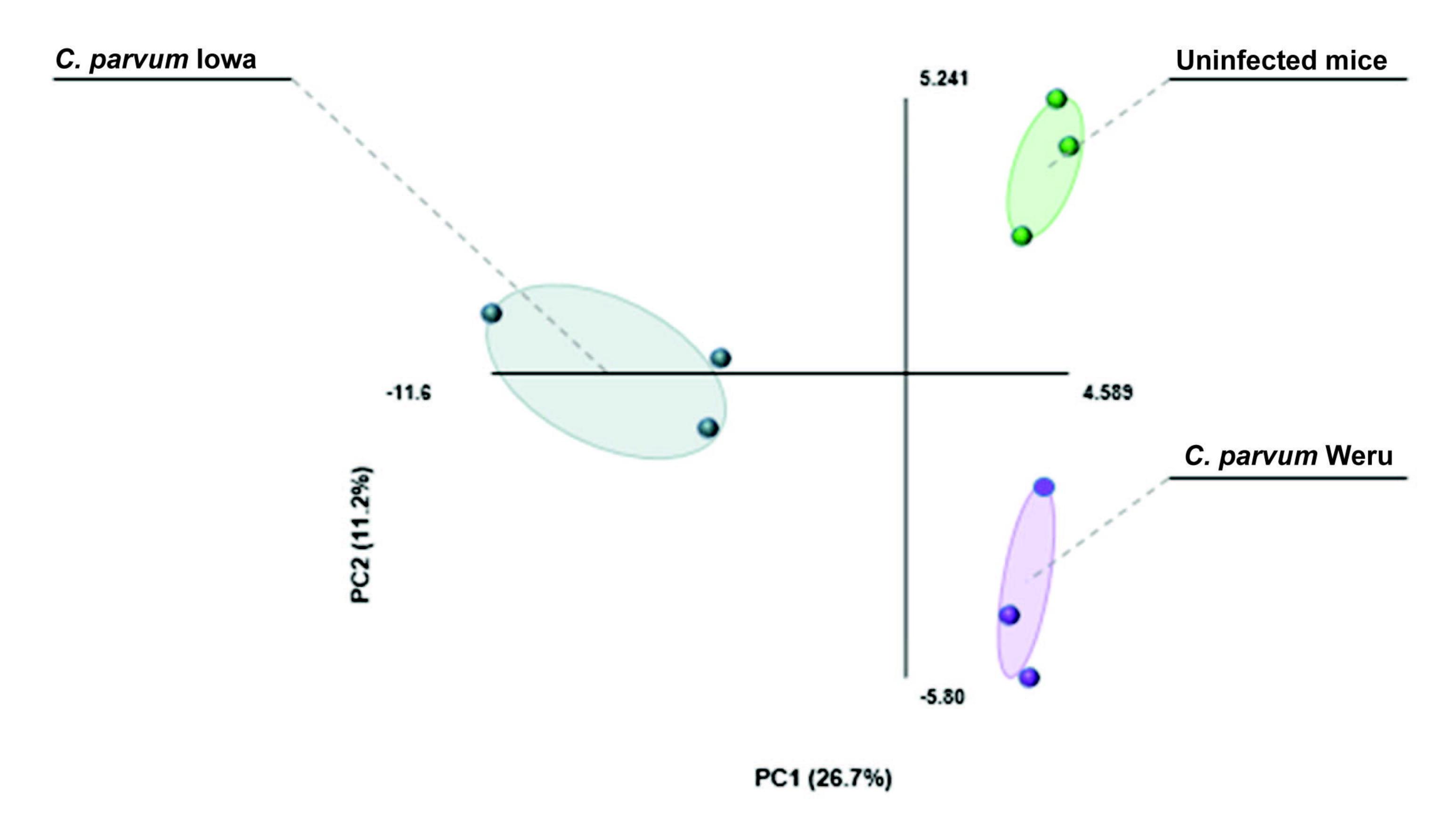
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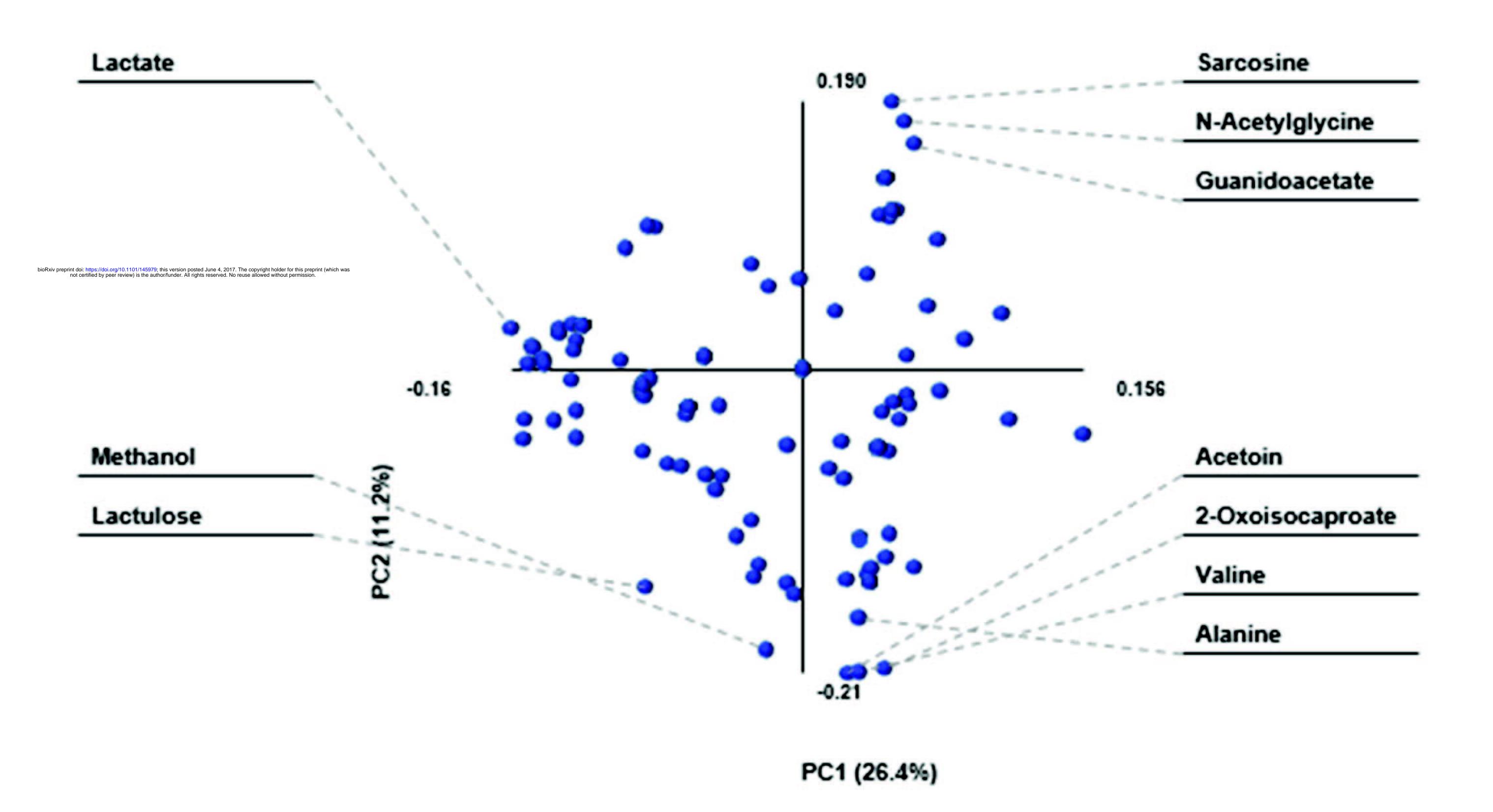
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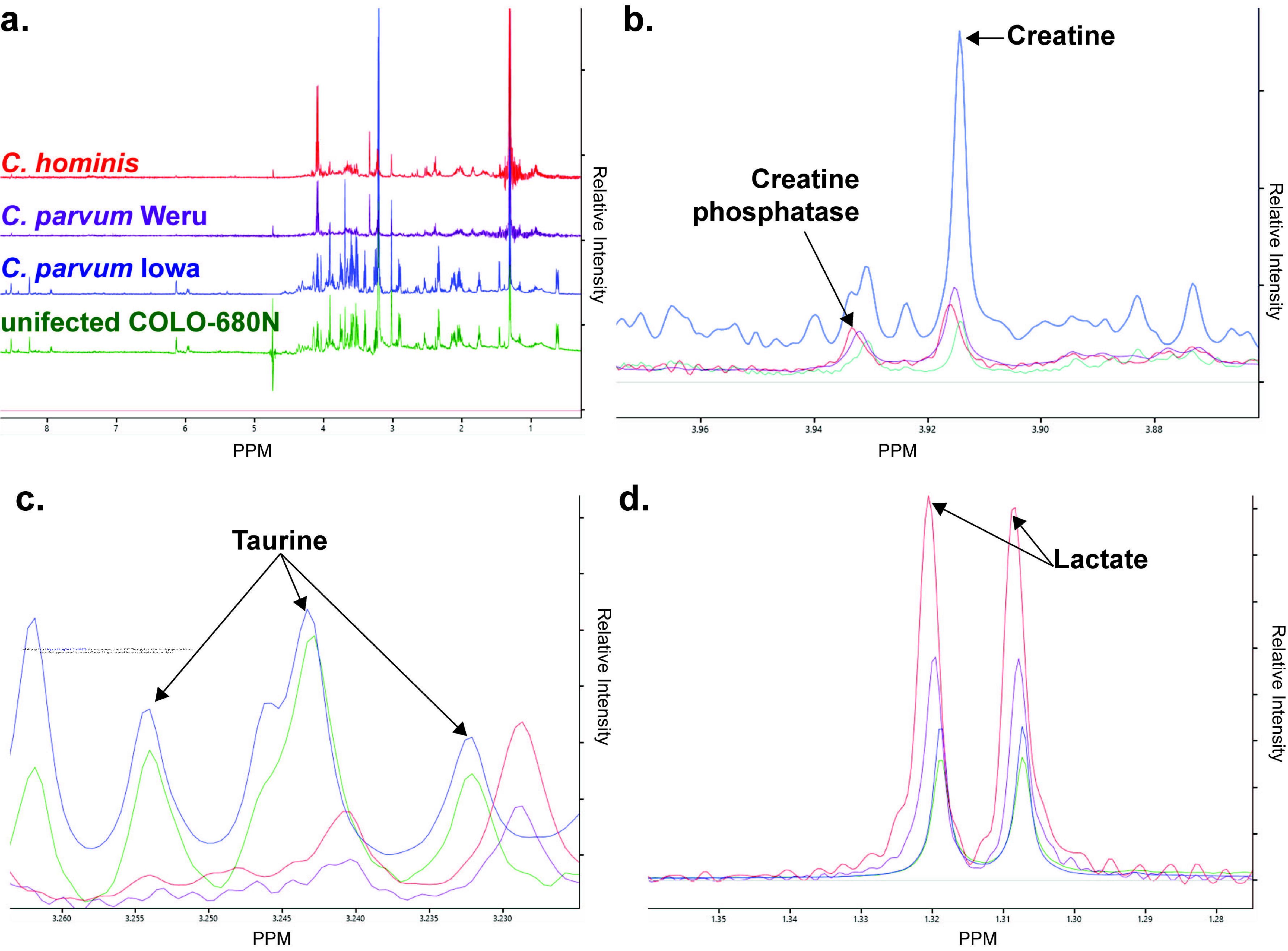
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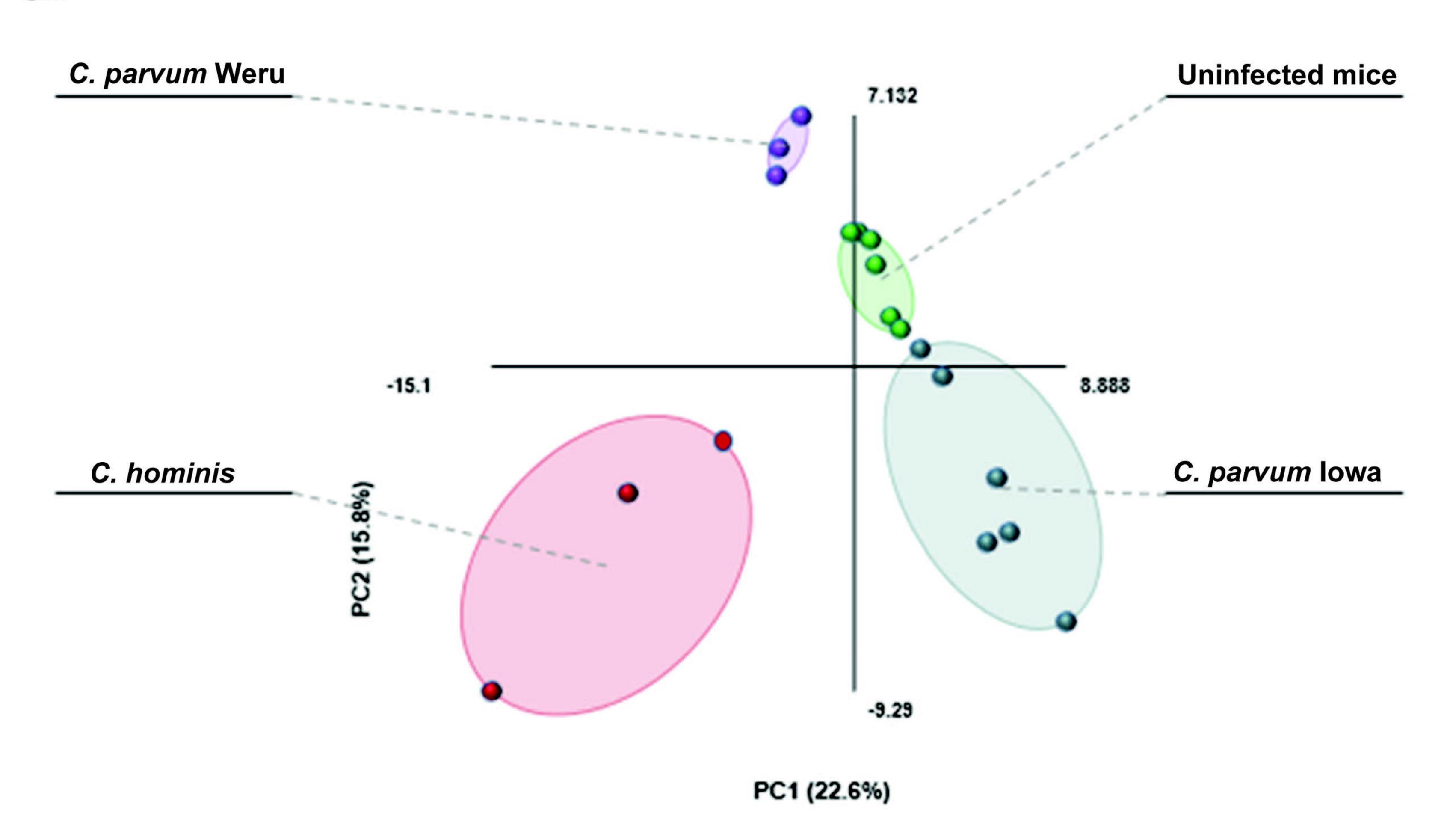


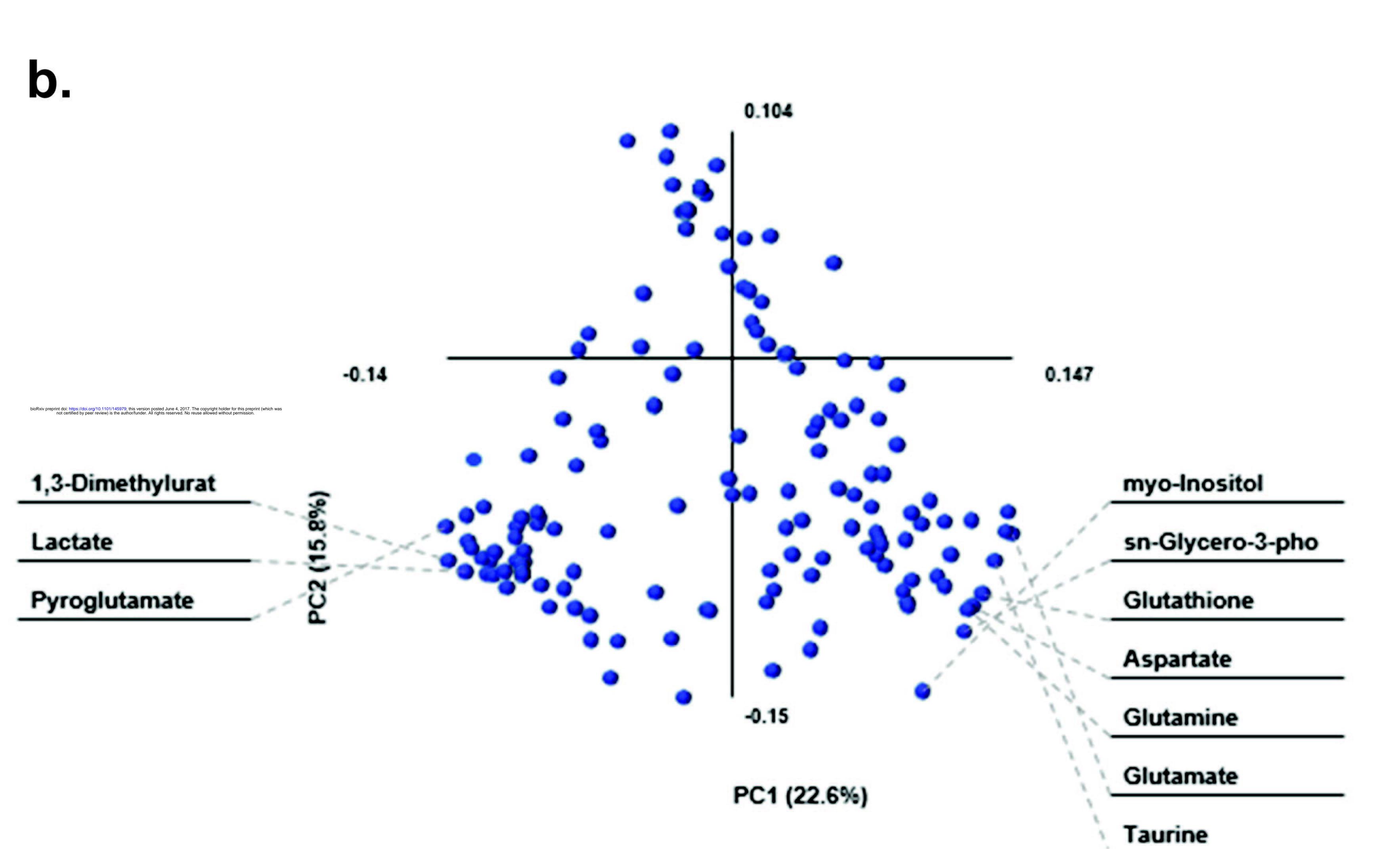
C00103 C00199 C00310 C00800 15 C00141 C00671 C00022 Glycien, serine and threonine metabolism C00312 C00618 C00231 C05125 C02047 bioRxiv preprint doi: https://doi.org/10.1101/145979; this version posted June 4, 2017. The copyright holder for this preprint (which was not certified by peer review) is the author/fur der. All rights reserved. No reuse allowed without permission. Taurine and Arginine and proline -log(p) hypotaurine synthesis C00191 C02554 metabolism Pantothenate and CoA biosynthesis Alanine, 5 C00506 aspartate and glutamate Synthesis and metabolism degredation of ketone C00721 C00089 C00718 C00103 bodies / C00095 C01678 C00606 C00052 C00252 C00668 C02336 C01231 C00190 C03033 0.0 0.2 0.7 0.1 0.3 0.5 0.6 0.4 ↓ C00267 C00519 C05844 C05122 C00191 C05345 Pathway Impact

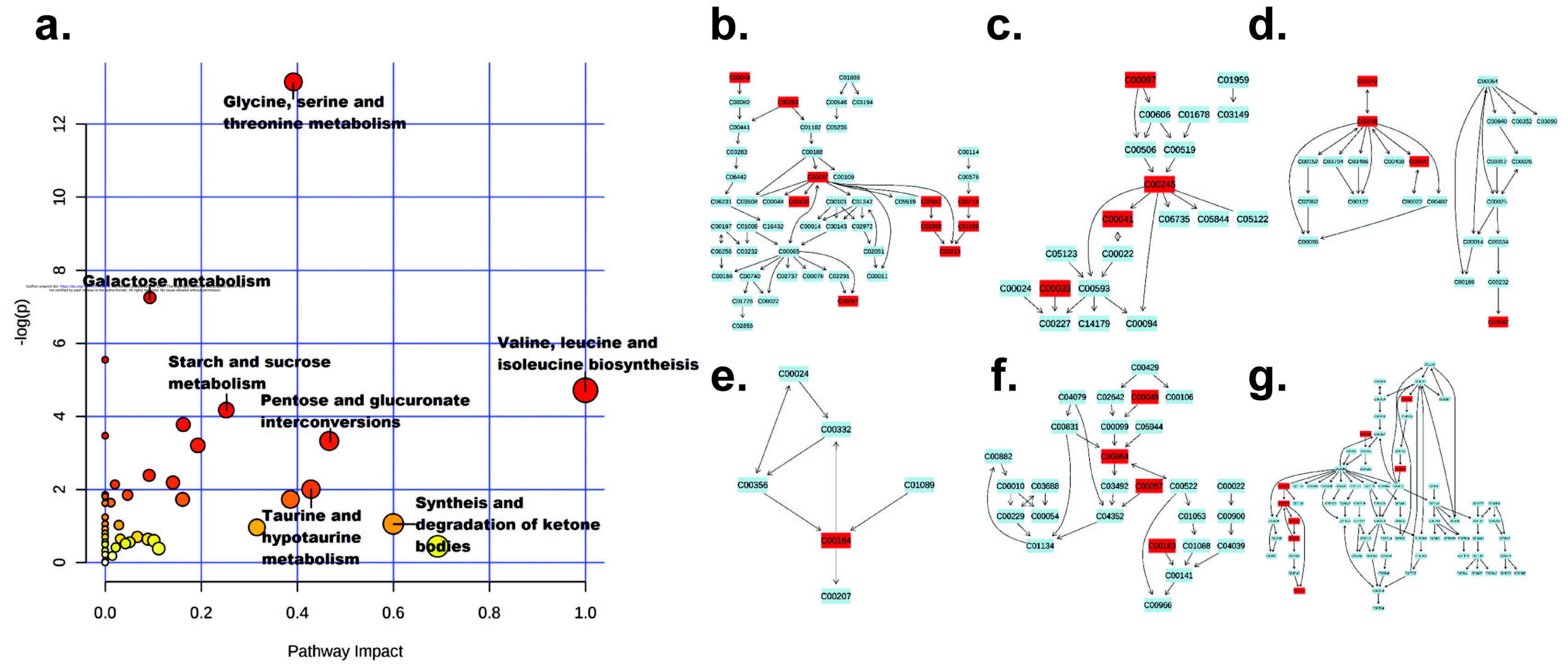


	Uninfected:	Infected:	Infected:	Infected:		Uninfected:	Infected:	Infected:	Infected:		Uninfected:	Infected:	Infected:	Infected:		Uninfected:	Infected:	Infected:	Infected:	Uninfected		Infected:	Infected:		Uninfected		Infected:	Infected:		
1,3-Diaminopropane	Control	lowa	vveru	Hominis	AMP	Control	Iowa	Weru	Hominis	Erythritol	Control	lowa	Weru	Hominis	Indole-3-lactate	Control	lowa	Weru	N-Methylhydantoin	Control	lowa	Weru	Hominis	Trimethylamine N-oxide	Control	lowa	Weru	Hominis	Key:	
1,3-Dihydroxyacetone					ATP					Ethanol					Isocitrate				N-Nitrosodimethylamine					Tyrosine						-1
1,3-Dimethylurate					Acetamide					Ethylene glycol					Isoleucine				N-Phenylacetylglycine					UDP-N-Acetylglucosamine						-0.9
1,6-Anhydro-β-D-glucose					Acetate					Formate					Isopropanol				N6-Acetyllysine					UDP-glucuronate						-0.8
2-Aminoadipate				72	Acetoacetate					Fructose					Lactate				NAD+					Valine						-0.7
2-Hydroxybutyrate					Acetone					Fucose					Lactose				Nα-Acetyllysine					Xylitol						-0.6
2-Hydroxyglutarate					Acetylsalicylate					Fumarate					Lactulose				O-Acetylcarnitine					myo-Inositol						-0.5
bioRxiv preprint doi: https://doi.org/10.1101/145979; this version pos 2-Hydrosectified by particular to the or/funder. All rights and the original propriets and the original propriet	osted June 4, 2017. The copyright har rights reserved. No reuse allowed wi	older for this preprint (which was ithout permission.			Alanine					Galactarate					Leucine				O-Acetylcholine					sn-Glycero-3-phosphocholine						-0.4
2-Hydroxyisocaproate					Allantoin					Galactitol					Levulinate				O-Phosphocholine					trans-4-Hydroxy-L-proline						-0.3
2-Hydroxyisovalerate					Alloisoleucine					Galactonate					Malate				O-Phosphoethanolamine					β-Alanine						-0.2
2-Hydroxyvalerate					Anserine					Galactose					Maleate				Oxypurinol					π-Methylhistidine						-0.1
2-Methylglutarate					Arabinitol					Glucarate					Malonate				Pantothenate											0
2-Oxobutyrate					Arabinose					Gluconate					Mandelate				Pyridoxine											0.1
2-Oxoisocaproate					Arginine					Glucose		- 44			Mannitol				Pyroglutamate											0.2
2-Phenylpropionate					Asparagine					Glucose-6-phosphate					Methanol				Pyruvate											0.3
3,5-Dibromotyrosine					Aspartate					Glucuronate					Methionine				Ribose											0.4
3-Hydroxy-3-methylglutarate					Azelate					Glutamate					Methylamine				Sarcosine											0.5
3-Hydroxyisovalerate					Betaine					Glutamine				ii.	Methylguanidine				Sebacate											0.6
3-Methylxanthine					Biotin					Glutaric acid monomethyl ester					Methylsuccinate				Succinate											0.7
3-Phenyllactate					Butanone					Glutathione				39	N,N-Dimethylformamide				Succinylacetone											0.8
4-Aminobutyrate					Carnitine					Glycerol					N,N-Dimethylglycine				Sucrose											0.9
4-Hydroxybutyrate					Choline					Glycine					N-Acetylaspartate				Syringate											1
4-Hydroxyphenylacetate					Citraconate					Glycolate					N-Acetylcysteine				Tartrate											1.1<
4-Hydroxyphenyllactate					Citrate					Glycylproline				ča.	N-Acetylglucosamine				Taurine											
4-Pyridoxate					Creatine					Guanidinosuccinate					N-Acetylglutamate				Theophylline											
5,6-Dihydrothymine					Creatine phosphate					Guanidoacetate					N-Acetylglutamine				Threonate											
5-Aminolevulinate					Creatinine					Homoserine					N-Acetylglycine				Threonine											
5-Hydroxylysine					Cysteine					Homovanillate					N-Acetylornithine				Thymine											
5-Methoxysalicylate					Dimethyl sulfone					Hydroxyacetone					N-Acetylserotonin				Trehalose											
ADP					Dimethylamine					Imidazole					N-Carbamoyl-β-alanine				Trimethylamine											

a.







a.

