RESEARCH ARTICLE

Open Access

Transcriptomics analysis of *Toxoplasma* gondii-infected mouse macrophages reveals coding and noncoding signatures in the presence and absence of MyD88



Kayla L. Menard*, Lijing Bu and Eric Y. Denkers*

Abstract

Background: *Toxoplasma gondii* is a globally distributed protozoan parasite that establishes life-long asymptomatic infection in humans, often emerging as a life-threatening opportunistic pathogen during immunodeficiency. As an intracellular microbe, *Toxoplasma* establishes an intimate relationship with its host cell from the outset of infection. Macrophages are targets of infection and they are important in early innate immunity and possibly parasite dissemination throughout the host. Here, we employ an RNA-sequencing approach to identify host and parasite transcriptional responses during infection of mouse bone marrow-derived macrophages (BMDM). We incorporated into our analysis infection with the high virulence Type I RH strain and the low virulence Type II strain PTG. Because the well-known TLR-MyD88 signaling axis is likely of less importance in humans, we examined transcriptional responses in both MyD88^{+/+} and MyD88^{-/-} BMDM. Long noncoding (Inc) RNA molecules are emerging as key regulators in infection and immunity, and were, therefore, included in our analysis.

Results: We found significantly more host genes were differentially expressed in response to the highly virulent RH strain rather than with the less virulent PTG strain (335 versus 74 protein coding genes for RH and PTG, respectively). Enriched in these protein coding genes were subsets associated with the immune response as well as cell adhesion and migration. We identified 249 and 83 non-coding RNAs as differentially expressed during infection with RH and PTG strains, respectively. Although the majority of these are of unknown function, one conserved IncRNA termed mir17hg encodes the mir17 microRNA gene cluster that has been implicated in down-regulating host cell apoptosis during *T. gondii* infection. Only a minimal number of transcripts were differentially expressed between MyD88 knockout and wild type cells. However, several immune genes were among the differences. While transcripts for parasite secretory proteins were amongst the most highly expressed *T. gondii* genes during infection, no differentially expressed parasite genes were identified when comparing infection in MyD88 knockout and wild type host BMDM.

Conclusions: The large dataset presented here lays the groundwork for continued studies on both the MyD88-independent immune response and the function of lncRNAs during *Toxoplasma gondii* infection.

Keywords: Toxoplasma gondii, Parasite, Macrophages, Noncoding RNA, IncRNA, MyD88

^{*} Correspondence: kmenard@unm.edu; edenkers@unm.edu Center for Evolutionary and Theoretical Immunology and Department of Biology, University of New Mexico, Albuquerque, NM, USA



© The Author(s). 2021 **Open Access** This article is licensed under a Creative Commons Attribution 4.0 International License, which permits use, sharing, adaptation, distribution and reproduction in any medium or format, as long as you give appropriate credit to the original author(s) and the source, provide a link to the Creative Commons licence, and indicate if changes were made. The images or other third party material in this article are included in the article's Creative Commons licence, unless indicated otherwise in a credit line to the material. If material is not included in the article's Creative Commons licence and your intended use is not permitted by statutory regulation or exceeds the permitted use, you will need to obtain permission directly from the copyright holder. To view a copy of this licence, visit http://creativecommons.org/licenses/by/4.0/. The Creative Commons Public Domain Dedication waiver (http://creativecommons.org/publicdomain/zero/1.0/) applies to the data made available in this article, unless otherwise stated in a credit line to the data.

Menard et al. BMC Genomics (2021) 22:130 Page 2 of 20

Background

The intracellular apicomplexan Toxoplasma gondii is a globally distributed parasitic microorganism infecting both humans and animals. In humans alone, Toxoplasma is conservatively estimated to be present in over a billion individuals [1]. After ingestion of tissue cysts or oocysts, an acute phase commences characterized by parasite dissemination throughout the host as rapidly dividing tachyzoites. This is followed by establishment of latent infection, in which tachyzoites differentiate into slowly replicating bradyzoites that form cysts in tissues of the central nervous system and skeletal muscle [2, 3]. Latent, or chronic, infection is asymptomatic in most cases, but the parasite may reactivate in immunocompromised populations leading to life-threatening disease [4]. Primary infection during pregnancy can lead to major birth defects and sequelae of infection later in life [5].

Toxoplasma is well known for its ability to stimulate strong Th1 immunity that has as its origin early production of IL-12 by dendritic cells [6, 7]. The IFN-y produced during infection confers resistance to the parasite, and indeed this cytokine is central in the ability to survive acute Toxoplasma infection [8]. While protective, IFN-γ production can result in host pathology if not appropriately regulated by counter-inflammatory cytokines such as IL-10 [9, 10]. A major function of IFN-y is to elicit inflammatory macrophages that are major antimicrobial effectors during in vivo infection [11–13]. Paradoxically, macrophages along with dendritic cells also serve as early cells targeted for infection, and it has been suggested that they act as Trojan horses to enable establishment of *T. gondii* in the host [14–18]. For these reasons, macrophages are an especially important cell type to study both the host immune response and T. gondii behavior during intracellular infection.

Substantial work in mouse models has revealed an important role for Toll-like receptor (TLR) and the adaptor molecule MyD88 in innate immune recognition of T. gondii [19, 20]. The invasion-associated parasite protein profilin functions as a ligand for TLR11 and TLR12, initiating MyD88-dependent immunity [21-24]. Given the central role of the MyD88 protein in the early innate immune response in mice to T. gondii infection, it is important to understand how deletion of MyD88 impacts transcription of downstream immune genes in infected cells. In humans, the basis of immune recognition is less clear because TLR11 is present as a pseudogene and TLR12 is absent from the genome [25]. Furthermore, a study of a pediatric population with an autosomal recessive MyD88 deficiency revealed that these individuals retain resistance to all but a minimal number of pyogenic bacterial infections [26, 27]. Thus, determining MyD88-independent responses to infection with *Toxoplasma* and other microbial pathogens is an important avenue of investigation in both humans and mice.

We therefore employed RNA sequencing (RNA-seq) to determine the transcriptome of MyD88^{+/+} and MyD88^{-/-} bone marrow-derived macrophages (BMDM) following infection with *T. gondii*. In addition to yielding information on protein coding responses, RNA-seq provides insight into responses of long noncoding RNA (lncRNA), defined as transcripts greater than 200 nucleotides with no protein coding potential. lncRNAs are widely involved in gene regulation, and their study is an emerging area of interest in infection and immunology [28–31].

Our approach involved infection with high virulence (Type I strain RH) and low virulence (Type II strain PTG) isolates of Toxoplasma. Amongst Type II strains, some differences in the intensity of cytokine responses have been noted with different isolates but we employed a strain that has been extensively used in previous studies [32]. In mice, Type I strains induce a hyperinflammatory cytokine response rapidly culminating in host death. The immune response is more restrained during Type II infection, enabling host survival and parasite establishment of latent infection [33, 34]. In vitro studies have revealed that infection with these strains activates partially nonoverlapping host signaling pathways leading to distinct responses. For example, infection with Type I parasites triggers strong and sustained activation of STAT3 and STAT6 resulting in the generation of macrophages with an M2 phenotype [35, 36]. Type II infection triggers NFκB activation and robust IL-12 production [37]. The present study provides important information on global transcriptional changes in macrophages infected with these two Toxoplasma strains in the presence and absence of MyD88.

In addition to examining the transcriptional changes in macrophages, use of RNA-seq technology enabled us to simultaneously harvest data on the transcriptomes of high and low virulence *Toxoplasma* during initial stages of intracellular infection. This allowed us to compare gene expression differences between *T. gondii* strains, as well as examine differences in parasite gene expression when infecting MyD88^{+/+} versus MyD88^{-/-} macrophages. Together, this dataset provides a host and parasite genomic framework for understanding the interactome that emerges during intracellular infection with *Toxoplasma*.

Results

Dual RNA sequencing of *Toxoplasma*-infected macrophages identifies host and parasite transcripts

We infected wild type and MyD88 knockout (KO) bone marrow-derived macrophages with both Type I (RH) and Type II (PTG) *Toxoplasma* tachyzoites, then collected samples 6 h later for high throughput RNA-seq

Menard et al. BMC Genomics (2021) 22:130 Page 3 of 20

(Fig. 1). We selected 6 h for our analysis because this time point occurs prior to the first parasite mitotic division, controlling for differences in replication rate between Type I and Type II strains. This time also enabled us to determine the earliest macrophage responses to infection. We used a multiplicity of infection (MOI) of 4:1 or 5:1. The percent infection, measured via fluorescence microscopy at 6 h over multiple biological replicates, ranged from 70.4-95.7%. Sequencing was performed on 4 biological replicates for uninfected samples and 3 biological replicates for infected samples. We mapped mouse reads to GENCODE version M21, a database containing sequences for 58,899 protein-coding transcripts and approximately 30,462 lncRNA transcripts. We mapped Toxoplasma reads to ME49 strain sequences in the ToxoDB database. As expected, mouse sequences comprised the vast majority of reads in infected samples (Fig. 2). The percentage of reads mapping to the T. gondii genome ranged from 2.49 to 18.20% between samples. The variability in percentage of mapped reads between replicates correlated only weakly, at best, with percent infection measured via fluorescence microscopy (RH $R^2 = 0.18$; PTG $R^2 = 0.01$) but did correlate more strongly with the number of parasites per infected cell (RH $R^2 = 0.15$; PTG $R^2 = 0.68$). Factors in addition to the number of parasites present likely contribute to the variability in the number of parasite transcripts produced. The background level of T. gondii reads in uninfected samples was determined to not affect the parasite gene expression results presented herein and likely represent mis-mapping of mouse genes, since housekeeping genes were among the top Toxoplasma genes in uninfected samples. Principal component analysis (PCA) plots of mapped mouse reads demonstrate that the treatment (in this case parasite strain) accounted for data variability, but also that the biological replicate contributed substantially to the variability observed (Additional files 1, 2 and 3). PCA plots of mapped Toxoplasma reads demonstrate that the parasite strain largely accounted for data variability (Additional files 4, 5).

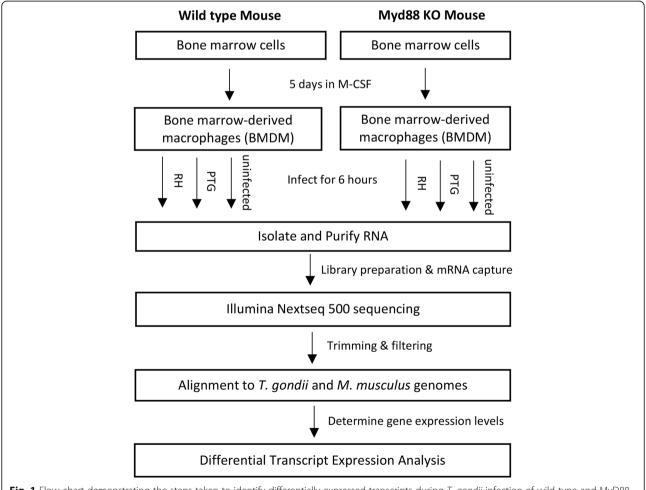


Fig. 1 Flow chart demonstrating the steps taken to identify differentially expressed transcripts during *T. gondii* infection of wild type and MyD88 KO mouse macrophages

Menard et al. BMC Genomics (2021) 22:130 Page 4 of 20

Sample	InputReads	Dropped%	Mouse%	Toxo%	Shared%
88M_R1	61,762,778	14.12%	99.42%	0.17%	0.41%
88M_R2	56,747,189	14.30%	99.79%	0.05%	0.16%
88M_R4	58,468,923	13.46%	99.56%	0.14%	0.30%
88M_R5	57,490,724	14.15%	99.68%	0.12%	0.20%
88PTG_R2	60,902,535	15.03%	96.73%	2.54%	0.73%
88PTG_R4	66,115,488	14.46%	87.93%	11.79%	0.28%
88PTG_R5	60,649,643	14.46%	94.81%	4.86%	0.33%
88RH_R2	60,321,939	15.13%	93.08%	6.23%	0.69%
88RH_R4	68,854,936	13.61%	80.96%	18.20%	0.83%
88RH_R5	65,090,963	14.01%	92.91%	6.92%	0.17%
wtM_R1	55,456,945	14.85%	98.91%	0.22%	0.87%
wtM_R2	59,120,326	13.01%	98.39%	0.91%	0.70%
wtM_R4	58,630,005	13.65%	99.62%	0.11%	0.27%
wtM_R5	60,702,006	13.80%	99.61%	0.14%	0.25%
wtPTG_R2	61,964,608	13.68%	97.08%	2.49%	0.43%
wtPTG_R4	60,765,357	14.45%	90.84%	8.60%	0.56%
wtPTG_R5	60,673,573	13.32%	94.04%	5.60%	0.36%
wtRH_R2	60,507,226	12.67%	94.57%	4.71%	0.72%
wtRH_R4	65,497,292	13.72%	86.63%	13.12%	0.25%
wtRH_R5	63,579,905	15.34%	93.55%	6.24%	0.21%

Fig. 2 Overview of RNA-sequencing reads mapping to both mouse and *Toxoplasma* genomes. A total of 20 RNA samples were submitted for sequencing, and characteristics of each sample are provided here. Column 1 denotes the sample name. 88, MyD88 KO BMDM; wt, wild type BMDM; M, noninfected macrophages; RH, macrophages infected with Type I RH strain *Toxoplasma*; PTG, samples infected with *T. gondii* Type II PTG strain. The numbers indicate independent biological replicates. InputReads (Column 2) denotes the number of reads obtained for each sample. Dropped % (Column 3) indicates the percent of input reads deemed low-quality and dropped. Mouse % (Column 4) is the percent of high-quality reads that mapped to the mouse genome. Toxo % (Column 5) denotes the percent of high-quality reads that mapped to the *T. aondii* genome. Shared % (Column 6) indicates the percent of high-quality reads mapping to both mouse and *T. gondii* genomes

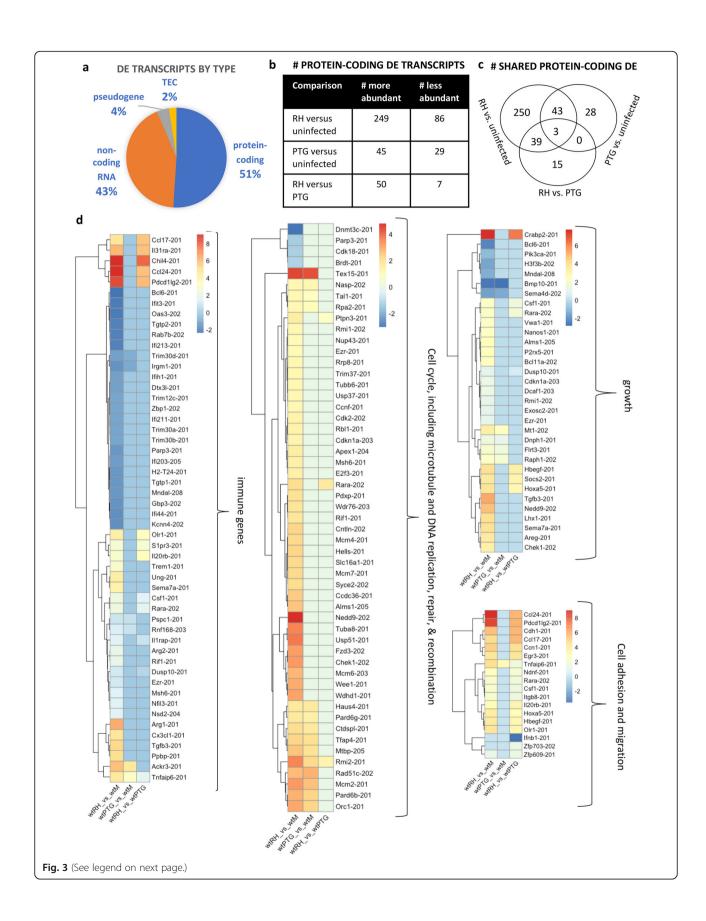
Type I strain parasites trigger stronger protein-coding gene expression effects compared to type II parasites

We defined differentially expressed (DE) transcripts using a *p*-value of equal or less than 0.05 and a fold change of 2 or greater. Among the wild type mouse samples, DE transcripts were primarily protein-coding (51%) and non-coding (43%), with pseudogenes and TEC (To be Experimentally Confirmed) comprising 4 and 2% of the hits respectively (Fig. 3a). A complete listing of DE transcripts for the three wild type comparisons (RH vs uninfected, PTG vs uninfected, and RH vs PTG) is shown in Additional file 6.

Among the protein-coding sequences, substantially more DE transcripts were differentially expressed with the Type I RH infection versus with the less-virulent Type II PTG infection (335 and 74, respectively). This indicates that RH has a stronger impact on the host macrophages relative to PTG. 57 transcripts were differentially expressed between RH and PTG, including previously known immune genes ccl24, csf1, socs2 and ccl17 (Fig. 3b and Additional file 6). Venn diagrams reveal that 46 DE transcripts (62%) are shared between RH and PTG infection (Fig. 3c).

Heat maps demonstrate that many genes related to the immune response, cell cycle, DNA replication, DNA recombination, DNA repair, growth, cell adhesion, and cell migration were differentially expressed during T. gondii infection (Fig. 3d). Numerous immune genes were of higher or lower abundance during RH infection, confirming that activation and suppression of immunity during *Toxoplasma* infection extends to the cellular level (Fig. 3d). In confirmation of previous studies [35, 36, 38], immune-related genes Arg1 and ccl17 were more abundant in RH versus uninfected cells. Many cell adhesion and migration genes were more abundant in both the RH versus uninfected and RH versus PTG comparisons. Many genes related to the cell cycle were differentially expressed in both RH versus uninfected and PTG versus uninfected. The DE genes for cell cycle include several genes relating to microtubule organizing center and DNA replication, recombination, and repair. This is of interest because Toxoplasma is thought to co-opt microtubules for its own survival [39, 40]. Many cell growth genes were of higher abundance, particularly for RH versus uninfected. Gene ontology analysis and KEGG pathway analysis results support the data shown

Menard et al. BMC Genomics (2021) 22:130 Page 5 of 20



Menard et al. BMC Genomics (2021) 22:130 Page 6 of 20

(See figure on previous page.)

Fig. 3 A much greater number of protein-coding genes are differentially expressed during infection with the highly virulent *Toxoplasma* RH strain than with the less virulent PTG strain. Wild type BMDM were infected with either the highly virulent RH strain or the less-virulent PTG strain, and 6 h later RNA was isolated for sequencing. Differentially expressed mouse transcripts were identified based on statistical significance (PPDE greater than 0.95) and a fold change of greater or less than 2. **a** Classification of differentially expressed mouse transcripts as either protein-coding, non-coding, pseudogene, or TEC (To be Experimentally Confirmed). **b** Total number of protein-coding transcripts of higher or lower abundance during infection. **c** Venn diagrams of differentially expressed protein-coding transcripts showing shared and unique expression patterns between infection strains. **d** Heat maps displaying trends among functionally related genes. Experiments were performed in at least triplicate with BMDM preparations from separate mice

in the heat maps (Additional file 7). In addition to the functional categories displayed in the heat maps, gene ontology analysis indicates that metabolic processes are also strongly differentially expressed in the RH strain (Additional file 7). Additional heat maps with each replicate displayed individually reveal that sample wtRH_4 had stronger effects than other replicates but the same overall trends (Additional Files 8 and 9).

Many noncoding transcripts are differentially expressed during infection of wild type BMDM

Among the mouse reads mapped to GENCODE/ Ensembl, we analyzed the noncoding transcripts separately from the protein-coding transcripts. The majority (63%) of the differentially expressed noncoding transcripts identified in wild type BMDM are classified in GENCODE/Ensembl as retained_intron noncoding RNAs, defined as alternatively spliced transcripts believed to contain intronic sequences relative to other coding transcripts of the same gene (Fig. 4a). Many of these intronic transcripts may be pieces of pre-mRNAs or excised introns that are targeted for degradation. Since we cannot rule out a function for them as regulatory RNAs, they were included in this analysis. 17% of the noncoding RNAs are classified as processed_transcript, a general term for a gene/transcript that lacks an open reading frame. Nine percent of the noncoding RNAs fell into the category of lincRNA, defined as long intergenic noncoding RNA. Four percent are classified as nonsense_mediated_decay, transcripts that contain sequences tagging them for destruction. While not specifically defined as noncoding in Ensembl, nonsense_ mediated_decay transcripts could possibly have functions as noncoding RNAs, so were included in the analysis. Five percent are classified as antisense or "transcripts that overlap the genomic span of a proteincoding locus on the opposite strand". Bidirectional_promoter lncRNAs, sense_intronic, and snoRNA comprised 1% or less of the noncoding transcripts. Small RNAs, such as snoRNAs, were included in the analysis but constitute an exceedingly small portion of the overall noncoding DE transcripts identified. The reason for their underrepresentation is likely because small RNAs were not selected for in the initial RNA isolation process or in the polyA tail selection step of the library preparation process. Therefore, almost the entirety of the noncoding transcripts identified are lncRNAs, but this was by study design.

During RH infection, we identified 155 noncoding transcripts that were of higher abundance, and 94 transcripts that were of lower abundance (Fig. 4b). In comparison, 70 noncoding transcripts were of higher abundance and 13 were of lower abundance during PTG infection. When comparing RH to PTG infection, 22 noncoding transcripts were of higher abundance and 11 were of lower abundance. These 33 lncRNAs (Fig. 4d) are prime candidates to determine the role of lncRNA in parasite strain specific responses during infection. 31 noncoding transcripts were shared between RH and PTG infection (Fig. 4c and e). These 31 transcripts are the most likely candidates to be important for infection since they are similarly regulated in a strain-independent manner. A full list of noncoding DE transcripts for the three comparisons in MyD88+/+ BMDM (RH vs uninfected, PTG vs uninfected, and RH vs PTG) can be found in Additional file 10. Using qRT-PCR, differential expression of 4 lncRNAs (mir17hg, D43Rik, Loc105, and Gm19434) strongly validated the RNA-seq results (Additional file 11).

While at least three lncRNAs (Ftx, Snhg5 and Snhg15) have known functions, most of the DE long noncoding transcripts we identified have unknown function. However, many lncRNAs are associated with immune-related protein coding genes. Ftx, which is more abundant during RH infection, is a well-studied lncRNA with roles in cancer and X-chromosome inactivation [41, 42]. Two lncRNAs more highly abundant during RH infection, Snhg15 and Snhg5, are host genes for snoRNA. With roles in cancer, they appear to function as molecular sponges for microRNAs [43-46]. The conserved mir17hg lncRNA is a host gene for the mir17 microRNA cluster and is more abundant during both RH and PTG infection. Mir17 microRNAs are known to have a role in regulating apoptosis during T. gondii infection [29, 47, 48]. Interestingly, two Siva1 intronic lncRNAs (Siva1– 203 and Siva1-205) were more abundant during RH infection, but the Siva1 protein-coding gene, an apoptosisinducing factor, was not a DE. Similarly, three Nfkb1

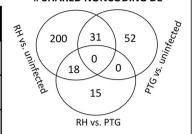
Menard et al. BMC Genomics (2021) 22:130 Page 7 of 20

a **NONCODING DE TRANSCRIPTS BY TYPE** antisense snoRNA_ bidirectional_pr sense_intr_ 1% omoter_IncRNA onic 0% **lincRNA** 1% nonsense me diated decay 4% retained processed transcript intron 63% 17%

b # OF NONCODING DE TRANSCRIPTS

Comparison	# more abundant	# less abundant
RH versus uninfected	155	94
PTG versus uninfected	70	13
RH versus PTG	11	22

C # SHARED NONCODING DE



LIST OF NONCODING TRANSCRIPTS DIFFERENTIALLY REGULATED BETWEEN RH AND PTG

Transcript Name	log2 FC	Transcript Type
Dock4-211	-3.62	retained_intron
Xrn1-204	-2.57	retained_intron
Dpp9-203	-2.32	retained_intron
Ddx58-210	-2.01	processed_transcript
Oas3-204	-1.71	retained_intron
Ubap2l-214	-1.69	retained_intron
A330040F15Rik-202	-1.57	antisense
Ifi203-207	-1.55	retained_intron
Mndal-203	-1.50	retained_intron
Rasa4-204	-1.45	retained_intron
P2ry14-204	-1.28	retained_intron
Nrp1-203	-1.26	retained_intron
Tmcc1-207	-1.26	retained_intron
Heatr5a-203	-1.17	retained_intron
Stat1-210	-1.17	nonsense_mediated_decay
Ncf1-203	-1.14	retained_intron
Jpx-201	-1.13	lincRNA
Snx10-206	-1.11	retained_intron
Apobec3-219	-1.09	retained_intron
9330175E14Rik-201	-1.08	lincRNA
Mtm1-209	-1.04	retained_intron
Rnpep-208	-1.03	retained_intron
Irf3-212	1.05	retained_intron
Osgin2-204	1.16	processed_transcript
5830432E09Rik-201	1.24	antisense
Angptl2-203	1.32	retained_intron
Frg2f1-204	1.61	processed_transcript
Socs2-209	2.00	nonsense_mediated_decay
Stat5a-207	2.42	processed_transcript
Gm19434-201	3.53	antisense
Hbegf-202	3.84	retained_intron
A930007I19Rik-204	4.80	antisense
Gm19951-201	4.80	lincRNA

LIST OF NONCODING DE TRANSCRIPTS SHARED BETWEEN RH AND PTG INFECTION

Transcript Name	log2 FC	Transcript Type
2310022A10Rik-202	-1.96	processed_transcript
Lat2-207		retained_intron
4930589L23Rik-201	-1.16	lincRNA
Xylt2-205	-1.10	retained_intron
Siva1-205	1.04	retained_intron
Cep83-204	1.10	retained_intron
Cdk4-207	1.10	retained_intron
Ptger2-202	1.20	retained_intron
5430416N02Rik-201	1.21	lincRNA
Slc1a5-207	1.22	retained_intron
Gm17092-201	1.44	antisense
Rbl1-202	1.50	retained_intron
Slbp-206	1.57	retained_intron
Raph1-203	1.60	retained_intron
Cdc25a-206	1.65	retained_intron
Mboat1-203	1.68	processed_transcript
Gm34589-202	1.69	lincRNA
D330041H03Rik-204	1.71	retained_intron
Bhlhe40-204	1.76	retained_intron
Odc1-205	1.80	nonsense_mediated_decay
AC121821.1-206	1.82	retained_intron
Xndc1-209	1.90	retained_intron
Tyms-206	1.97	retained_intron
Hspa8-208	1.98	retained_intron
Gm2415-204	2.00	antisense
Foxd2os-201	2.04	processed_transcript
Mir17hg-201	2.42	lincRNA
Chaf1b-204	2.71	retained_intron
Rif1-206	3.32	retained_intron
Hells-203	3.64	retained_intron
Cdca7-203	3.70	processed_transcript

Fig. 4 Many non-coding transcripts are differentially expressed during infection with *Toxoplasma*. Wild type BMDM were infected with either the highly virulent RH strain or the less-virulent PTG strain, and 6 h later RNA was isolated for sequencing. Differentially expressed mouse non-coding transcripts were identified based on statistical significance (PPDE greater than 0.95) and a fold change of greater or less than 2. **a** Classification of differentially expressed mouse non-coding transcripts by type. **b** Total number of non-coding transcripts of higher or lower abundance during infection. **c** Venn diagrams of differentially expressed non-coding transcripts revealing shared and unique expression patterns between infection strains. **d** List of all noncoding transcripts differentially expressed between RH and PTG. **e** List of all noncoding differentially expressed transcripts shared between RH and PTG infection. Experiments were performed in at least triplicate with BMDM from separate mice

Menard et al. BMC Genomics (2021) 22:130 Page 8 of 20

intronic lncRNAs (Nfkb1–208, Nfkb1–210, and Nfkb1–202) were more abundant during RH infection but not the Nfkb1 protein-coding gene itself. While possibly an artifact, the differential abundance of these intronic sequences from their protein-coding counterpoints possibly suggests a function of these RNA species separate from the protein-coding gene. STAT1–210 (nonsense mediated decay) and STAT5a-207 (processed transcript) are differentially expressed in RH versus PTG and RH versus uninfected but the protein-coding transcript for these immune genes were not regulated. Several immune-related protein-coding genes (Socs2, ifi44, ifi203, ifi213) were coregulated with overlapping lncRNAs (Socs2–209, Ifi44–203, ifi203–207, and ifi213–203).

Sequencing of MyD88 KO mouse Transcriptome reveals few gene expression differences between MyD88^{+/+} and MyD88^{-/-} BMDM during *T. gondi* infection

The breakdown of all DE transcripts by type was remarkably similar for infection of wild type and MyD88 KO mice (Fig. 3a and Fig. 5a). This was also true for the

noncoding transcripts more specifically (Figs. 4a and Fig. 5d). In general, the overall number of protein-coding and noncoding DE transcripts for RH and PTG infection was similar for wild type and MyD88 KO BMDM (Figs. 3b, 4b, 5b, and e). Likewise, the number of DE transcripts shared between RH and PTG was similar for wild type and MyD88 KO macrophages (Figs. 3c, 4c, 5c, and f). A full list of the protein-coding and noncoding DE transcripts for MyD88 KO macrophages is provided in Additional file 6 and Additional file 10.

We next focused on direct comparisons between MyD88^{+/+} and MyD88^{-/-} BMDM responses regarding protein-coding RNA (Fig. 6) and noncoding (Fig. 7) profiles. Only a few protein-coding and noncoding transcripts were differentially expressed between wild type and MyD88 KO BMDM (Figs. 6a and 7a). 10 protein-coding and 5 noncoding transcripts were differentially expressed between uninfected wild type and MyD88 KO macrophages. Similarly, 9 protein-coding and 7 noncoding transcripts were differentially expressed between RH infected wild type and MyD88 KO macrophages. Only

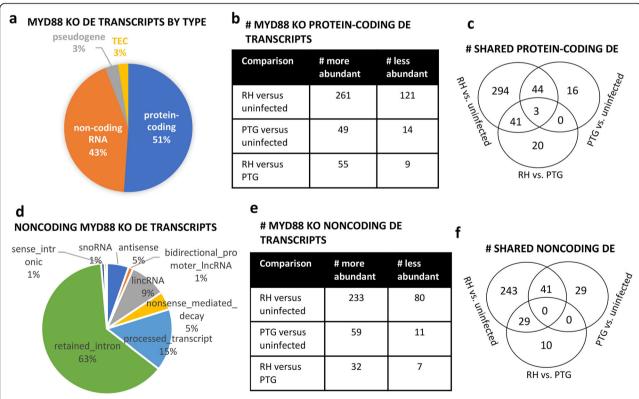


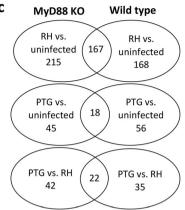
Fig. 5 MyD88 KO BMDM have similar gene expression signatures as wild type BMDM. BMDM from MyD88 KO mice were infected with either the RH or PTG strain, and 6 h later RNA was isolated for sequencing. Differentially expressed mouse transcripts were identified based on statistical significance (PPDE greater than 0.95) and a fold change of greater or less than 2. **a** Classification of differentially expressed MyD88 KO transcripts as either protein-coding, non-coding, pseudogene, or TEC (To be Experimentally Confirmed). **b** Total number of protein-coding transcripts of higher or lower abundance during infection. **c** Venn diagrams of differentially expressed protein-coding transcripts. **d** Classification of differentially expressed MyD88 KO non-coding transcripts by type. **e** Total number of non-coding transcripts of higher or lower abundance during infection. **f** Venn diagrams of regulated non-coding transcripts revealing shared and unique expression patterns between infection strains. Experiments were performed in at least triplicate with BMDM from separate mice

Menard et al. BMC Genomics (2021) 22:130 Page 9 of 20

a # PROTEIN-CODING DE TRANSCRIPTS

Comparison	# more abundant	# less abundant
Myd88 KO uninfected versus wild type uninfected	4	6
Myd88 KO RH versus wild type RH	4	5
Myd88 KO PTG versus wild type PTG	2	8

Myd88 KO PTG vs. wild type PTG 6 Differences wild type and Myd88 KO shared between treatments



Similarities wild type and Myd88 KO

d

MyD88 KO uninfected versus wild type uninfected

Downregul	ated

log2 FC	Name	Description	
-2.97	Marco-201	Macrophage receptor	
-1.26	Efcab7-201	EF-Hand Calcium Binding Domain 7	
-2.34	Arg1-201	Catalyzes hydrolysis of arginine	
-6.86	Csf3-201	Colony stimulating factor, cytokine	
-2.04	Adamts1-201	A disintegrin-like and metalloprotease	
-4.55	Capn11-201	Calcium-dependent cysteine proteases	
Upregula	Upregulated		
10.15	lfi208-201	Interferon activated gene 208	
1.33	Axl-201	AXL Receptor Tyrosine Kinase	
6.99	Chrnb4-201	Cholinergic receptor subunit, forms cation channel	
6.29	Gm16867-201	Mitoferrin-1, transports iron in mitochondria	

MyD88 KO PTG versus wild type PTG

Downregulated

log2 FC	Name	Description	
-2.91	lgkc-201	Immunoglobulin Kappa Light Chain (VJ)	
-2.59	Marco-201	Macrophage receptor	
-1.71		Member RAS Oncogene Family, endosome sorting and recycling	
-5.06	Ifng-201	Interferon Gamma, cytokine	
-6.50	Csf3-201	Colony stimulating factor, cytokine	
-2.27	Garem1-201	GRB2-Associated And Regulator Of MAPK	
-1.54		Acyl-CoA desaturase 1, involved fatty acid biosynthesis	
-2.15	Lancl3-201	Lantibiotic synthetase component C-like 3 (bacterial)	
Upregulated			

Upregulated

1.50	Pillua3-201	Pleckstrin nomology like domain family A member 3
3.02	Mid1-203	Midline 1, associates microtubules

MyD88 KO RH versus wild type RH

Downregul	atec
-----------	------

log2 FC	Name	Description
-1.31	Efcab7-201	EF-Hand Calcium Binding Domain 7
		Family With Sequence Similarity 13
-1.39	Fam13a-201	Member A
		Member RAS Oncogene Family,
-1.82	Rab4a-202	endosome sorting and recycling
-5.76	Capn11-201	Calcium-dependent cysteine proteases
-1.04	Fads2-201	Fatty Acid Desaturase 2

Upregulated

8.61	lfi208-201	Interferon activated gene 208	
		MAPK-Interacting And Spindle-	
1.47	Mapk1ip1-203	Stabilizing Protein-Like	
		Mitoferrin-1, transports iron in	
5.83	Gm16867-201	mitochondria	
3.05	Mid1-203	Midline 1, associates microtubules	
	1.47 5.83	1.47 Mapk1ip1-203 5.83 Gm16867-201	

Fig. 6 A minimal number of protein-coding genes were differentially expressed between wild type and MyD88 KO BMDM. Macrophages from wild type and MyD88 KO mice were infected with either the RH or PTG strain, and 6 h later RNA was isolated for sequencing. Differentially expressed mouse protein-coding transcripts between wild type and MyD88 KO BMDM were identified based on statistical significance (PPDE greater than 0.95) and a fold change of greater or less than 2. **a** Total number of protein-coding transcripts of higher or lower abundance between wild type and MyD88 KO mice for uninfected, RH-infected, and PTG-infected samples. **b** Venn diagrams of the gene expression differences between wild type and MyD88 KO mice showing shared expression changes for uninfected, RH-infected, and PTG-infected samples. **c** Venn diagrams revealing similarities between wild type and MyD88 KO gene expression changes for RH vs. uninfected, PTG vs. uninfected, and PTG vs. RH. **d** List of all differentially expressed protein-coding transcripts between wild type and MyD88 KO mice. Coloring indicates those transcripts shared between comparisons

Menard et al. BMC Genomics (2021) 22:130 Page 10 of 20

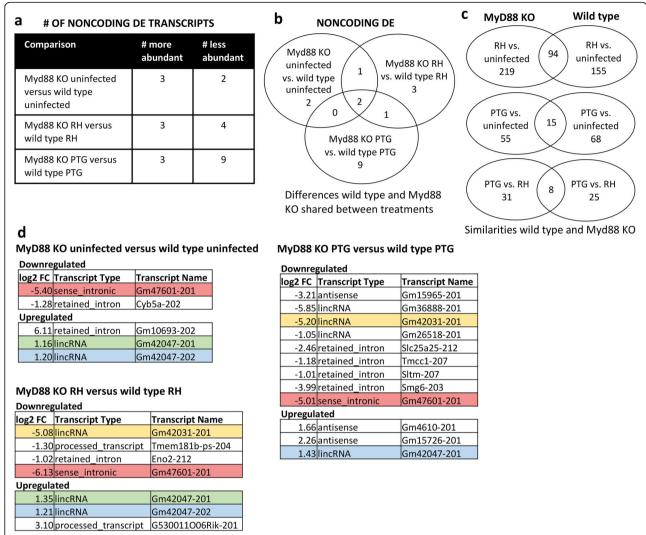


Fig. 7 Only a few non-coding genes were differentially expressed between wild type and MyD88 KO BMDM. Cells from wild type and MyD88 KO mice were infected with *Toxoplasma* tachyzoites, and RNA was isolated for sequencing 6 h later. Differentially expressed mouse non-coding transcripts between wild type and MyD88 KO BMDM were identified based on statistical significance (PPDE greater than 0.95) and a fold change of greater or less than 2. **a** Total number of non-coding transcripts of higher or lower abundance between wild type and MyD88 KO macrophages for uninfected, RH-infected, and PTG-infected samples. **b** Venn diagrams of the non-coding gene expression differences between wild type and MyD88 KO cells revealing shared expression changes for uninfected, RH-infected, and PTG-infected samples. **c** Venn diagrams indicating similarities between wild type and MyD88 KO non-coding gene expression changes for RH vs. uninfected, PTG vs. uninfected, and PTG vs. RH. **d** List of all differentially expressed non-coding transcripts between wild type and MyD88 KO BMDM. Colored transcripts indicate those shared by different comparisons

10 protein-coding and 12 noncoding transcripts were differentially expressed between PTG infected MyD88^{+/+} and MyD88^{-/-} BMDM. The degree of overlap between these three comparison groups is shown in Fig. 6b (coding transcripts) and Fig. 7b (noncoding transcripts).

In general, there was substantial overlap between the DE transcripts for wild type and MyD88 KO macrophages ranging from $\sim 20{\text -}50\%$ depending on the infection treatment (coding transcripts, Fig. 6c; noncoding transcripts, Fig. 7c). Functional analysis of the similarities between RH-infected wild type and MyD88 KO macrophages revealed enrichment of genes for cell cycle,

DNA recombination, DNA replication, DNA repair, and cell migration (Additional file 7). Interestingly, immune genes were not functionally enriched in both MyD88^{+/+} and MyD88^{-/-} macrophages, despite differential expression of several immune genes such as ccl17, arg1, socs2, and ccl24 during RH infection of wild type and MyD88 KO cells. Regarding lncRNAs, greater abundance of mir17hg was common to both wild type and MyD88 KO infection by RH and PTG. Siva1–205 and Nfkb1–210 lncRNAs were of higher abundance during RH infection of wild type and Myd88 KO macrophages.

Menard et al. BMC Genomics (2021) 22:130 Page 11 of 20

Several immune-related protein-coding genes were among the DE genes when comparing MyD88+/+ and MyD88^{-/-} macrophages, and a subset of these are known to be relevant in the response to Toxoplasma. Transcripts encoding the macrophage receptor Marco and the cytokine Csf3 were of lower abundance in the MyD88 KO BMDM relative to wild type cells for both uninfected and PTG treatment (Fig. 6d). Transcripts for Ifng (encoding IFN-γ) were less abundant in MyD88^{-/-} cells during PTG infection. IFN-y is well known to be essential for survival of mice to acute T. gondii infection [8]. Transcripts for Arg1 (encoding arginase that catalyzes arginine hydrolysis) were less abundant in uninfected MyD88 KO macrophages. Toxoplasma is an arginine auxotroph and upregulation of Arg1 in wild type cells is thought to be a host defense mechanism to reduce levels of arginine [35, 49]. Ifi208 (interferon activated gene 208) is more abundant in MyD88 KO BMDM compared to wild type during RH infection.

Less is known regarding the differentially expressed noncoding RNAs identified. However, some results lncRNAs, Gm42047-201 stand out. Two Gm47601-201, were differentially expressed among all three conditions (MyD88 KO uninfected vs. wild type uninfected, MyD88 KO RH versus wild type RH, and MyD88 KO PTG versus wild type PTG) suggesting these two lncRNAs may be important in the difference between the two macrophage strains (Fig. 7d). 5 of the 18 noncoding transcripts (28%) are long intergenic noncoding RNAs meaning they are not near or overlapping any protein-coding genes. This is of practical interest because intergenic lncRNAs are more amenable to genetic knock down, making them easier targets to study. One lncRNA, Sltm-207, is intronic to the protein-coding gene SLTM and is less abundant in MyD88 KO compared to wild type during PTG infection. When overexpressed, SLTM acts a general inhibitor of transcription that eventually leads to apoptosis [50].

Sequencing of the *Toxoplasma* Transcriptome revealed no differences in gene expression between infection of wild type and MyD88 KO macrophages

Toxoplasma reads were mapped to the ToxoDB ME49 strain and differentially expressed genes were identified (p-value equal or less than 0.05 and fold change of 2 or greater). Because both Type I and Type II strains were mapped to ME49 (Type II), genetic differences between the strains could result in issues mapping to specific genes. While the overall mapping rate to RH was higher than for PTG, discrepancies for specific genes could exist. Additionally, the number of T. gondii reads obtained for many of the samples was below our projected target of 10 M reads per sample (actual range was between 1.2 M and 10 M reads per sample). This limited

our ability to detect lowly expressed genes and could result in detecting fewer DE genes overall. Because we also did not analyze a non-infection control for *T. gondii* sequences (which is difficult to do), we conducted fewer comparisons than for the mouse transcriptome data. We directly compared RH and PTG infection for both wild type and MyD88 KO macrophages. We also compared wild type versus MyD88 KO, for RH and PTG, respectively.

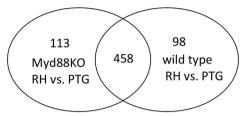
For both wild type and MyD88 KO, approximately 120 parasite genes were more abundant in RH infection compared to PTG infection (Fig. 8a). Unexpectedly, a larger number of genes (approximately 440) were less abundant in RH compared to PTG parasites (Fig. 8a). The opposite was true when comparing mouse differential gene expression between RH and PTG (Fig. 3b). More than half (approximately 55%) of the parasite DE transcripts are hypothetical proteins with no known function or homology to other proteins with known functions (Additional file 12). Surprisingly, no differentially expressed Toxoplasma genes were identified when comparing MyD88 KO RH versus wild type RH and MyD88 KO PTG versus wild type PTG host strains (Fig. 8a). This indicates that *Toxoplasma* behaves the same regardless of the host macrophage MyD88 genotype. Most (approximately 80%) of the differentially expressed genes between RH and PTG were shared between wild type and MyD88 KO strains (Fig. 8b and Additional File 12). This high degree of similarity is consistent with the absence of significantly differentially expressed genes between T. gondii infection of wild type and MyD88 KO strains.

Pathway analysis identified metabolism of purines and several amino acids as different between RH and PTG infection (Fig. 8c-f). Overall, these transcripts were largely less abundant during RH infection compared to PTG. Gene ontology analysis identified microtubulebased movement as less abundant during RH infection compared to PTG infection (Fig. 8e and f). Several motor proteins (myosin, dynein, intraflagellar transport protein, and kinesin) were less abundant in RH versus PTG in both wild type and MyD88 KO (Additional file 12). However, two dynein proteins were more abundant in RH versus PTG for both wild type and MyD88 KO. T. gondii is known to use motor proteins for invasion into the host and for replication [51, 52]. Several SAG-related sequences (which encode a major family of tachyzoite surface proteins) were more abundant in RH versus PTG but a subset was also less abundant (Additional file 12). Many secretory proteins (ROP38, GRA11, ROP28, ROP2A, ROP23, ROP46, MIC17B, and ROP4) were less abundant in RH versus PTG in both wild type and MyD88 KO. GRA15 was more abundant in RH versus PTG but interestingly only Menard et al. BMC Genomics (2021) 22:130 Page 12 of 20

a

Comparison	# more abundant	# less abundant
Wild type RH versus wild type PTG	119	437
Myd88KO RH versus Myd88KO PTG	123	448
Myd88KO RH versus wild type RH	0	0
Myd88KO PTG versus wild type PTG	0	0

b



f C DE Pathways wild type RH versus wild type PTG

Pathway	Gene Count
Biosynthesis of antibiotics	17
Purine metabolism	12
Valine, leucine and isoleucine degradation	7
Tryptophan metabolism	7
Fatty acid degradation	6
Cysteine and methionine metabolism	6
Superpathway of glyoxylate cycle and fatty acid degradation	4
Glycine, serine and threonine metabolism	4
Monobactam biosynthesis	4
Tyrosine metabolism	4
Selenocompound metabolism	4
Glycerolipid metabolism	4
Alpha-Linolenic acid metabolism	4
Drug metabolism - other enzymes	4

eDE Gene Ontology: Biological Process wild type RH versus wild type PTG

Gene Ontology: Biological Process Name	Gene Count
Microtubule-based movement	15
Movement of cell or subcellular component	15
Glucosamine-containing compound metabolic	
process	5
Amino sugar metabolic process	5
Chitin metabolic process	5

d DE Pathways Myd88KO RH versus Myd88KO PTG

Pathway	Gene Count
Biosynthesis of antibiotics	19
Purine metabolism	12
Valine, leucine and isoleucine degradation	8
Cysteine and methionine metabolism	7
Fatty acid degradation	6
Monobactam biosynthesis	5
Tyrosine metabolism	5
Tryptophan metabolism	5
Superpathway of L-methionine salvage and degradation	4
Superpathway of glyoxylate cycle and fatty acid degradation	4
Glycine, serine and threonine metabolism	4
Lysine degradation	4
Histidine metabolism	4
Selenocompound metabolism	4
Glycerolipid metabolism	4
Glycerophospholipid metabolism	4
Pyruvate metabolism	4
Glyoxylate and dicarboxylate metabolism	4
Butanoate metabolism	4
Isoquinoline alkaloid biosynthesis	4

† DE Gene Ontology: Biological Process Myd88 RH versus Myd88 PTG

Gene Ontology: Biological Process Name	Gene Count
Microtubule-based process	17
Microtubule-based movement	14
Movement of cell or subcellular component	14
glucosamine-containing compound metabolic	
process	5
Aminoglycan metabolic process	5
Chitin metabolic process	5
Amino sugar metabolic process	5

Fig. 8 (See legend on next page.)

Menard et al. BMC Genomics (2021) 22:130 Page 13 of 20

(See figure on previous page.)

Fig. 8 Greater than 550 *Toxoplasma gondii* genes were differentially expressed between the highly virulent RH strain and the less virulent PTG strain, but none were significantly different between wild type mice and MyD88 KO mice. BMDM from wild type and MyD88 KO mice were infected with RH or PTG tachyzoites, and 6 h later RNA was isolated for sequencing. Differentially expressed *T. gondii* genes were identified based on statistical significance (PPDE greater than 0.95) and a fold change of greater or less than 2. **a** Total number of *T. gondii* genes of higher or lower abundance for each comparison. **b** Venn diagrams showing shared expression changes between wild type and MyD88 KO samples for RH vs. PTG. **c** Pathways enriched between RH and PTG infection of wild type macrophages **d** Pathways enriched between RH and PTG infection of MyD88 KO BMDM. **e** Biological process enrichment between RH and PTG infection of MyD88 KO cells

during infection of MyD88^{-/-} BMDM. The rhoptry protein ROP8 was less abundant in RH versus PTG only in MyD88 KO host cells. Oocyt wall protein (OWP1) was less abundant in RH versus PTG in both wild type and MyD88^{-/-} macrophages. Transcripts for the bradyzoite antigen BAG1 were less abundant during RH infection compared to PTG infection in both wild type and MyD88 KO. This is consistent with the RH strain being unable to form cysts during infection. We validated the lower abundance of Bag1 in RH versus PTG using qRT-PCR (Additional File 13).

Independently of the DE analysis, we examined which Toxoplasma genes were most highly expressed during infection. Using normalized expression values, we compared the top 100 expressed genes between all four samples (RH infection of wild type and MyD88^{-/-} cells; PTG infection of wild type and MyD88^{-/-} BMDM). 75 out of 100 most expressed genes were shared between all four samples and these are listed in Fig. 9. The most highly expressed gene was that encoding rhoptry protein ROP1, a secretory molecule whose function is unclear. Many other T. gondii secreted proteins were represented, including dense granule proteins (8 in total), rhoptry proteins (2 in total), and microneme proteins (7 in total). Together, they comprise 22.7% of the most highly expressed genes. 23 out of 75 genes (30.7%) were ribosomal proteins. Only six out of the 75 genes (8%) were hypothetical, substantially less than the overall percentage of hypothetical proteins.

Discussion

In this study, we undertook a global analysis of the coding and noncoding mouse transcriptome during Type I and Type II *T. gondii* infection of wild type and MyD88 KO BMDMs. Numerous previous studies have examined the host protein-coding response to infection using RNA-sequencing in various parasite strains, cells/organs, and host species, including bone-marrow derived macrophages and bone-marrow derived dendritic cells [49, 53–59]. While not the primary focus of our study, we identified many similarities to previous studies in the wild type mouse protein-coding response, including dysregulation of immune and metabolic genes. One of our more interesting findings is that significantly more host

genes were differentially expressed during Type I rather than Type II infection. Our studies were conducted on cells infected for 6 h, prior to the first parasite mitotic event. Thus, strain-specific differences in replication do not account for the effect. This indicates that Type II infection is overall more silent than Type I infection, a finding that is consistent with in vivo evidence in mice that Type II parasites overall cause less severe disease than Type I strains [60, 61]. Of interest is to consider the transcriptomic changes during RH and PTG infection in light of the polymorphic effector molecules expressed by these strains. Type I parasite strains such as RH express an active form of ROP16. This rhoptry protein is a host-directed kinase that activates STAT3, 5 and 6 signaling pathways that down-regulate several immune response genes [35, 62]. In our results, we found that many immune genes were both more and less abundant during T. gondii infection, clearly indicating that other factors, in addition to ROP16, are relevant to macrophage infection. Conversely, PTG, a type II strain, expresses GRA15, a secreted dense granule protein that activates several proinflammatory genes through an NFκB pathway [63]. This is perhaps in contradiction to our findings, where most host immune genes were only weakly affected by PTG infection. The influence of these parasite effector molecules on the transcriptional responses reported here await further investigation.

Another interesting finding was the higher abundance of cell migration genes in both the RH versus uninfected and RH versus PTG comparisons. This is consistent with data indicating that *T. gondii* enhances the motility of dendritic cells, a phenomenon hypothesized to facilitate dissemination throughout the host [18, 64]. Our results suggest that this phenomenon extends beyond dendritic cells to macrophages as well.

In this study, the parasites were centrifuged and washed prior to infecting BMDM, but parasite preparations likely contain small amounts of fibroblast debris. We cannot rule out that the presence of some fibroblast debris could possibly have their own effects on gene expression. If so, this would most likely apply to mouse genes differentially expressed during both RH and PTG infection and less likely to affect only one strain, as the two strains were treated identically with regard to

Menard et al. BMC Genomics (2021) 22:130 Page 14 of 20

Transcript_id Gene	Product	XM_002368064.1	LDH1	lactate dehydrogenase LDH1
XM_002364175.2 ROP1	rhoptry protein ROP1	XM_002368099.2	RPS3A	ribosomal protein RPS3A
XM_002364187.2 RPP2	ribosomal protein RPP2	XM_002368156.2	NA	hypothetical protein
XM 002364283.1 GRA4	dense granule protein GRA4	XM_002368164.2	SRS29B	SAG-related sequence SRS29B
XM_002364363.1 NA	chaperonin protein BiP	XM_002368166.1	SRS29C	SAG-related sequence SRS29C
XM_002364630.2 RPL7	ribosomal protein RPL7	XM_002368237.2	HSP90	heat shock protein HSP90
XM_002364766.1 TUBA1	alpha tubulin TUBA1	XM_002368264.2	GRA12	dense granule protein GRA12
XM_002364813.1 NA	apical membrane antigen AMA1	XM_002368490.2	MIC1	microneme protein MIC1
1	transporter%2C major facilitator family		1	elongation factor 1-alpha (EF-1-
XM_002364946.1 NA	protein	XM_002369227.2	NA	ALPHA)%2C putative
XM_002365020.1 NA	hypothetical protein	XM_002369230.2		dense granule protein GRA5
XM 002365248.2 RPL7A	ribosomal protein RPL7A	XM_002369565.2	MIC4	microneme protein MIC4
XM_002365321.1 NA	RNA recognition motif-containing protein	XM_002369622.2	ACT1	actin ACT1
XM_002365328.1 RPL27	ribosomal protein RPL27	XM_002369831.2	RPL5	ribosomal protein RPL5
XM_002365368.1 NA	14-3-3 protein	XM_002370158.1	NA	glucose-6-phosphate 1-dehydrogenase
XM_002365659.1 MAG1	MAG1			elongation factor 1-alpha (EF-1-
XM_002365660.2 GRA1	dense granule protein GRA1	XM_002370208.1		ALPHA)%2C putative
	heat shock protein HSP70	XM_002370293.2	RPS2	ribosomal protein RPS2
	ribosomal protein RPS18	XM_002370414.1		microneme protein MIC5
XM_002366330.2 GRA3	dense granule protein GRA3	XM_002370587.2	RPP0	ribosomal protein RPPO
XM_002366338.2 RPL3	ribosomal protein RPL3	XM_002370825.2	RPL10A	ribosomal protein RPL10A
XM_002366354.2 GRA2	dense granule protein GRA2	XM_002370955.2	NA	guanine nucleotide-binding protein
	ribosomal protein RPL15	XM_002371033.2	RPS15	ribosomal protein RPS15
XM_002366532.2 RPL37	ribosomal protein RPL37	XM_002371054.2	NA	hypothetical protein
XM_002366722.2 RPS5	ribosomal protein RPS5	XM_002371252.2	NA	protein disulfide isomerase
XM_002366831.2 ROP9	rhoptry protein ROP9	XM_002371283.2		ribosomal protein RPS27
XM_002366904.2 NA	heat shock protein 90%2C putative	XM_002371898.2	GRA6	dense granule protein GRA6
XM_002366935.2 RPS8	ribosomal protein RPS8	XM_002371980.2	NA	hypothetical protein
	ribosomal-ubiquitin protein RPS27A	XM_018779168.1	NA	hypothetical protein
	ribosomal protein RPL21	XM_018779175.1	MIC2	microneme protein MIC2
XM_002367039.2 NA	hypothetical protein	XM 018779309.1	MIC11	microneme protein MIC11
XM_002367154.1 RPS9	ribosomal protein RPS9	XM_018779512.1	RPS6	ribosomal protein RPS6
XM_002367312.2 MIC10	microneme protein MIC10	XM_018779668.1	NA	MIC2-associated protein M2AP
XM_002367318.2 NA	eukaryotic initiation factor-4A%2C putative	XM_018779815.1	MIC6	microneme protein MIC6
XM_002367572.2 GRA7	dense granule protein GRA7			polyadenylate binding protein%2C
XM_002367643.2 RPL8	ribosomal protein RPL8	XM_018780067.1	NA	putative
XM_002367646.2 SUB1	subtilisin SUB1	XM_018780542.1	RPS7	ribosomal protein RPS7
	translation elongation factor 2 family	XM_018781448.1	NA	beta tubulin
XM_002367737.2 NA	protein%2C putative	XM_018781602.1		SAG-related sequence SRS34A
XM_002367760.2 NA	cyclophilin precursor			glyceraldehyde-3-phosphate
		XM_018782090.1		dehydrogenase GAPDH1
		XM_018782799.1	NA	RNA recognition motif 2 protein

Fig. 9 Rhoptry, microneme, and dense granule genes are among the most abundant *Toxoplasma* transcripts. Using normalized expression values, the top 100 expressed genes were compared between the four samples (RH infecting wild type, RH infecting MyD88 KO, PTG infecting wild type, and PTG infecting MyD88 KO). 75 out of 100 were shared between all four samples and those shared are listed here

centrifugation and washing. The possibility that fibroblast factors rather than parasites per se mediate some of the effects seen is minimized by the fact that the fibroblasts are human in origin whereas the macrophages used for infection are mouse derived.

While many studies have assessed the protein-coding transcriptomic response to *T. gondii* infection, very few have looked at the noncoding RNA response to infection. Two previous studies examined expression of lncRNAs in human cells during *T. gondii* infection. One, using microarrays, found that at least 1000 human lncRNAs were differentially expressed during Type II infection of HFF cells [65]. Another used qRT-PCR to assess a panel of lncRNAs with known immune regulatory activity and found 31 lncRNAs were differentially

expressed during *T. gondii* infection of retinal müller glial cells [66]. Despite the low degree of sequence conservation between human and mouse lncRNAs, two lncRNAs, Mir17hg and Snhg15, differentially expressed in the Rochet et al. study were also differentially expressed in this study.

We previously looked at the expression of lncRNAs in mouse cells during *T. gondii* infection using microarrays [67]. In that study, we found 1522 lncRNAs differentially expressed during infection with the RH strain and 528 with the PTG strain. Here, we found 249 noncoding transcripts as differentially expressed during Type I infection and 83 noncoding transcripts as differentially expressed during Type II infection of wild type mouse macrophages. While we identified a smaller number of

Menard et al. BMC Genomics (2021) 22:130 Page 15 of 20

lncRNAs with RNA-sequencing than with microarrays, we found significant overlap including Mir17hg, Ftx, and Socs2–209. While difficult to directly compare, we identified approximately 55 lncRNAs shared between the two datasets based on gene names. We identified a larger number (155) of shared DE transcripts for mRNAs, possibly due to either more consistent naming or higher expression of protein-coding genes.

In this study, we identified 33 lncRNAs that were differentially expressed between RH and PTG. These would be important to pursue for their role in strain specific differences between Type I and Type II T. gondii. Additionally, 31 noncoding transcripts were differentially expressed in both RH and PTG infection. These 31 transcripts are perhaps most likely to be essential for infection as they are regulated in both strains. This study, combined with previous studies, provides a sense of the vast landscape of lncRNAs regulated during T. gondii infection whose functions we do not yet understand. Given the large number of lncRNAs identified in this study, as well as the emerging role of lncRNAs in regulating the immune response [30, 68], we believe this is an important avenue to investigate further in order to fully understand the immune response to *T. gondii* and other intracellular pathogens impacting human health. Functional studies employing approaches such as knockout or overexpression of lncRNAs is a necessary next step.

The present study is the first to examine the transcriptional response of MyD88 deficient mouse cells during T. gondii infection. The MyD88 protein plays an important role in the early innate immune response in mice to T. gondii infection [69]. The effect of MyD88 deletion on expression of downstream immune genes in infected cells was previously unknown. Additionally, this is an important avenue of research because the human immune response to Toxoplasma is not thought to depend on the TLR/MyD88 axis, and there is much interest in determining other avenues of immune recognition in humans and mice. Perhaps surprisingly, only a few genes were differentially expressed between wild type and MyD88 KO mice. This suggests that MyD88 has only minor effects on cellular transcriptional activity, at least within the time frame of our study. Several immune genes and two meiotic genes were among the differences. Two lncRNAs (Gm42047– 201 and Gm47601-201) were differentially expressed among all three conditions (RH, PTG, and noninfected), suggesting that these two lncRNAs may be especially important in the MyD88-dependent immune response. Further investigation of these protein-coding genes and noncoding transcripts in the context of the MyD88 KO immune response is important.

While not the primary focus of our study, we also examined parasite gene expression for RH and PTG infection of wild type and MyD88 KO macrophages. More

than 550 genes were differentially expressed between Type I and Type II T. gondii. In both the RNA-sequencing dataset and qRT-PCR validation, the Bag1 gene was less abundant in the RH strain versus the PTG strain. This result is unsurprising as Bag1 expression is specific to the bradyzoite stage of the parasite, a life cycle stage which the RH strain is incapable of achieving. Several microtubule and motor proteins (myosin, dynein, intraflagellar transport protein, and kinesin) were less abundant in RH versus PTG in both wild type and MyD88 KO. This result is surprising given the much faster growth rate of the RH strain, however, two dynein proteins were more abundant during RH infection. It is interesting that the most highly expressed Toxoplasma gene across samples was the rhoptry protein ROP1, a secretory molecule whose function is unknown. Determining the function of this protein could be interesting and important. Previous studies have used RNA-sequencing to examine T. gondii gene expression patterns [54-56, 58, 70]. In 2014, Pittman et al. compared acute and chronic Type II T. gondii infection of mouse brains. While difficult to directly compare the two studies, we also found that metabolic, biosynthetic, and translation genes were among the most highly expressed T. gondii genes regardless of strain type. In 2016, Zhou et al. examined RH gene expression during infection of porcine PK-15 cells. They found that metabolic genes were largely less abundant in intracellular RH tachyzoites compared to egressed parasites. We also found that many metabolic genes were less abundant in RH when compared to PTG infection. One of our more interesting findings is that no T. gondii genes were differentially expressed between wild type and MyD88 KO macrophages, suggesting that T. gondii behaves the same regardless of which host strain it infects. Nevertheless, it is possible that at later infection time points differences in the parasite transcriptome in wild type and KO cells would emerge.

Conclusions

While this study covered numerous disparate aspects of early intracellular infection, we were largely focused on two facets: (1) identifying long noncoding RNAs differentially expressed during *T. gondii* infection and (2) examining the transcriptional response of MyD88 KO cells. Host lncRNAs represent a largely unexplored layer in the immune response to *T. gondii*. The MyD88-independent transcriptional response may also be important in unraveling other mechanisms of immune regulation in the response to *T. gondii* in both humans and mice.

Methods

Mouse strains and generation of BMDM

C57BL/6 mice (The Jackson Laboratory) were used as the wild type strain in this study. The MyD88 KO mice contain a deletion of exon 3 (The Jackson Laboratory,

Menard et al. BMC Genomics (2021) 22:130 Page 16 of 20

B6.129P2(SJL)-Myd88tm1.1Defr/J). Animals were housed (3-5 per cage) and cared for according to the Guide for the Care and Use of Laboratory Animals (8th edition) under an IACUC approved protocol (19–200,854-MC). Mice were housed in 3 single-sided ventilated cage racks (RAIR HD Super Mouse 1800 Interchangeable Micro Isolator Unit 9 tier). The mice were housed in a specific pathogen-free facility under a 12:12 light/dark cycle with controlled temperature (22-24 °C) and humidity (50-60%). Mice were given free access to autoclaved standard mouse chow and water and were checked every 24 h for general health. Animals were rested for 1 week prior to generating BMDM. We used a total of 8 wild type mice and 8 MyD88 KO mice in this study. All mice were females between the ages of 6 and 8 weeks (17-20 g). The mice were euthanized using CO2 asphyxiation, as recommended by the American Veterinary Medical Association. Mice were euthanized in the morning in a separate room from caged mice. Bone marrow from a single mouse was used for each biological replicate for each mouse strain, with four biological replicates from four separate mice shown (4 replicates for uninfected mice samples and 3 replicates for infected samples). Femur and tibia were used as a source of bone marrow cells. Macrophages were generated from single cell suspensions of bone marrow cells by 5- or 6-day culture in L929-containing supernatants, as previously described [71]. One day prior to infection, BMDM were harvested, counted, and plated in 12-well tissue culture plates in human fibroblast medium (HFM) at a concentration of 1×10^6 cells per well. HFM consists of DMEM (Life Technologies) supplemented with 1% heat-inactivated bovine growth serum (Thermo Fisher Scientific), 100 U/ mL penicillin (Life Technologies), and 0.1 mg/mL streptomycin (Life Technologies).

Parasite strains and infections

Wild type Toxoplasma strains RH (Type I) and PTG (Type II) were used in this study. Tachyzoites of both strains were maintained by approximately twice-weekly passage on human foreskin fibroblast monolayers in HFM. Flasks of fully lysed fibroblasts were utilized for infections. If fibroblasts were only partially lysed, they were passed twice through a 27 Ga needle to release the parasites. All parasites were centrifuged and washed prior to infection to remove soluble material. Infections were accomplished by the addition of tachyzoites to mouse BMDM (4:1 or 5:1 ratio of parasites to cells) on 12-well plates (Falcon, non-tissue culture treated). Plates were briefly centrifuged (3 min, 200×g) to initiate contact between tachyzoites and macrophages. Cultures were incubated 6 h (37 °C, 5% CO2), then the cells were harvested for RNA extraction. Percent infection was calculated using an Olympus BX51 immunofluorescence microscope. DAPI was used to stain the nucleus. *Toxo-plasma*-specific polyclonal antibody conjugated to FITC (ThermoFisher Scientific) was used to stain the parasites. Percent infection of at least 70% was deemed acceptable.

RNA-seq sample preparation and Illumina NextSeq 500 sequencing

Total RNA was prepared from BMDM by RNeasy Mini Kit purification (Qiagen). The samples were subjected to Turbo DNase treatment (Life Technologies). Total RNA from each sample was quantified using a Qubit 3.0 Fluorometer. At least 1.5 µg per sample was submitted to the CETI Molecular Biology Core at the University of New Mexico, and RNA integrity was assessed using an Agilent 2100 Bioanalyzer. All samples had RIN values > 9.6, indicating the RNA was high quality. Libraries were prepared using the KAPA mRNA HyperPrep Kit with PolyA selection. In brief, mRNA was captured using magnetic oligo-dT beads. RNA was fragmented using heat and magnesium, and first strand was synthesized by random priming. Second strand synthesis and A-tailing were combined into one step, which involves converting the cDNA:RNA hybrid to double-stranded cDNA while incorporating dUTP into the second cDNA stand and adding dAMP to the 3' ends of the double-stranded cDNA fragments. Next, dsDNA adapters with 3'-dTMP were ligated to the A-tailed library fragments, and the library fragments with adapters at both ends were amplified using PCR. The strand marked with dUTP was not amplified, allowing strand-specific sequencing. Library quality was assessed using a Qubit and a Bioanalyzer. qRT-PCR of adapters was performed to determine the amount of library in each sample. Libraries were sequenced using an Illumina NextSeq 500 Sequencer generating paired-end, 75-bp read length sequences. 1 midthroughput run (150 M theoretical maximum clusters) and 3 high-throughput runs (400 M theoretical maximum clusters) were performed. Figure 1 indicates the total number of reads obtained per sample.

RNA-seq data analysis

Raw reads off sequencer were trimmed and filtered using Trimmomatic v0.36 (Bolger et al. 2014) with slide window of 4 nt, average score above 20 and minimum length of 36 nt. Filtered high quality reads were mapped to the annotated mouse genome release M21 from Gen-Code [72] and *T. gondii* ME49 (GenBank Assembly ID GCA_000006565.2) using RNA-Seq reads mapping tool Spliced Transcripts Alignment to a Reference (STAR) 2.5.3a [73]. Reads mapping were performed using STAR options: --genomeLoad LoadAndKeep --limitBAMsortRAM 50,000,000,000 --runMode alignReads --run-ThreadN 17 --outBAMsortingThreadN 7. No major changes were made to default settings other than to tune

Menard et al. BMC Genomics (2021) 22:130 Page 17 of 20

CPUs and memory. Gene expression levels were estimated using software featureCounts with default settings [74]. Differential gene expression (DE) analysis was performed using EBSeq v1.22.0 default settings [75]. A posterior probability of differential expression (PPDE) 0.95 or higher for EBSeq was set as cutoff for DE analysis. Workflow of read trimming and mapping was built using Unix shell commands with application GNU-Parallel [76] to perform jobs in parallel. Table summary and figure generation were performed with the R statistical computing environment [77] and Bioconductor [78], including the following packages: ggplot2 [79], reshape2 [80], and pheatmap v1.0.12 [81]. Heat maps were constructed using complete-linkage clustering using log2 fold change values or the z-score transformed FPKM values. PCA plots were constructed using SARTools v1.6 [82]. For mouse genes, functional enrichment analysis, including KEGG pathway analysis & Gene Ontology analysis, was performed using g:Profiler (g:Profiler version e96_eg43_p13_563554d) with g:SCS multiple testing correction method applying significance threshold of 0.05 [83]. For T. gondii genes, functional enrichment analysis was performed using g:Profiler (for gene ontology data) and ToxoDB Identify Metabolic Pathway tool (for KEGG pathway data) [84]. Venn diagrams, pie charts, and other data analysis was performed using Microsoft Excel software.

Quantitative RT-PCR

Total RNA was prepared using a RNeasy Mini Kit (Qiagen), and the samples were subjected to Turbo DNase treatment (Life Technologies). RNA was converted to cDNA using the SuperScript IV VILO Master Mix (ThermoFisher Scientific). Quantitative PCR was performed on target genes and normalized to the expression of the housekeeping gene Ppia (mouse gene) or βtubulin (T. gondii gene) using the SYBR green method (SsoAdvanced Universal SYBR Green Supermix, Bio-Rad) and the Bio-Rad CFX96 RT-PCR machine. Expression relative to uninfected control samples was calculated using the $\Delta\Delta$ Ct method. A control with no added reverse transcriptase was included for each sample. Primer sequences used in this study are Ppia (F-GCAT GTGGTCTTTGGGAAGGTG and R-GGGTAAAATG CCCGCAAGTCAA), Mir17hg (F-GGTGGCCACT CTGTTAATGTGC and R-TAACTGCAGCTTCT CCAGACCC), D43Rik (F-TTCTCAATACAACGCCCC AGGT and R-AAAAGGGGGAAGGATTGGGGAG), LOC105 (F-GGCACACCCATGATAGGCTGTA and R-CCTCCATACCCAGCACTGTCAA), Gm19434 TGACAGGGAAAAACAGAGCCCA and R-GTCACC CAGGGGAAAGCAATTG), β-tubulin (F-CGCCACGG CCGCTACCTGACT and R-TACGCGCCTTCCTCTG CACCC), and Bag1 (F-GACGTGGAGTTCGACA GCAAA and R-ATGGCTCCGTTGTCGACTTCT). Some of our uninfected samples were occasionally at the limit of detection of our qRT-PCR assay. In those cases, we used 35 cycles as the Cq (quantification cycle).

Supplementary Information

The online version contains supplementary material available at https://doi.org/10.1186/s12864-021-07437-0.

Additional file 1. Principal component analysis (PCA) plots of mouse RNA-sequencing data reveal associations between samples: PCA plots of mouse transcripts for wild type (wt) BMDM comparisons.

Additional file 2. Principal component analysis (PCA) plots of mouse RNA-sequencing data reveal associations between samples: PCA plots of mouse transcripts for MyD88 KO (k88) BMDM comparisons.

Additional file 3. Principal component analysis (PCA) plots of mouse RNA-sequencing data reveal associations between samples: PCA plots of mouse transcripts for MyD88 KO BMDM versus wild type BMDM comparisons.

Additional file 4 Principal component analysis (PCA) plots of *T. gondii* RNA-sequencing data reveal associations between samples: PCA plots of *T. gondii* transcripts for MyD88 KO (k88) BMDM versus wild type (wt) BMDM comparisons.

Additional file 5 Principal component analysis (PCA) plots of *T. gondii* RNA-sequencing data reveal associations between samples: PCA plots of *T. gondii* transcripts for RH versus PTG comparisons.

Additional file 6. Complete list of differentially regulated mouse protein-coding genes in MyD88*^{-/+} and MyD88*^{-/-} BMDM. Each tab in the spreadsheet corresponds to a specific pairwise comparison (e.g., RH vs. uninfected). Transcript name, Gene IDs, raw values, normalized values, PPDE values, fold changes, and other information are included.

Additional file 7. Functional analysis of differentially expressed protein-coding genes. Each tab in the spreadsheet corresponds to a specific pairwise comparison (e.g., RH vs. uninfected). Results were obtained using g:Profiler. Gene Ontology: Biological Process and KEGG Pathway analysis results are included.

Additional file 8. Heatmaps displaying individual replicates of differentially expressed immune and cell cycle genes in wildtype mice. Heatmaps displaying z-score transformed FPKM values of individual replicates among functionally related genes.

Additional file 9. Heatmaps displaying individual replicates of differentially expressed growth, cell adhesion, and migration genes in wildtype mice. Heatmaps displaying z-score transformed FPKM values of individual replicates among functionally related genes.

Additional file 10. Complete list of differentially expressed mouse noncoding genes. Each tab in the spreadsheet corresponds to a specific pairwise comparison (e.g., RH vs. uninfected). Transcript name, Gene IDs, raw values, normalized values, PPDE values, fold changes, and other information are included.

Additional file 11 RNA-seq IncRNA data validation by qRT-PCR. RNA from mouse BMDM were collected 6 h after infection with either RH or PTG strains of *T. gondii*, and qRT-PCR was performed. Fold changes represent the comparison of infected samples to uninfected samples. (a) qRT-PCR fold change values for 4 IncRNAs. (b) RNA-seq fold change values for the same 4 IncRNAs for comparison purposes. Experiments were completed at least three times with BMDM from three separate mice.

Additional file 12 Complete list of differentially expressed *Toxoplasma gondii* genes. The first tab corresponds to wild type RH versus wild type PTG. The second tab corresponds to Myd88KO RH versus Myd88KO PTG. The third tab lists the differentially regulated *T. gondii* genes common to both comparisons. Transcript ID, raw values, normalized values, PPDE values, fold changes, and other information are included.

Additional file 13 RNA-seq *Toxoplasma gondii* data validation by qRT-PCR. RNA from mouse BMDM were collected 6 h after infection with

Menard et al. BMC Genomics (2021) 22:130 Page 18 of 20

either RH or PTG strains of *T. gondii*, and qRT-PCR was performed. Fold changes represent the comparison of RH infected samples to PTG infected samples. RNA-sequencing and qRT-PCR data are displayed in one graph. Experiments were completed at least three times with BMDM from three separate mice.

Abbreviations

BMDM: Bone marrow-derived macrophages; Cq: quantification cycle; DE: Differentially expressed; GENCODE: Encyclopedia of DNA elements; HFM: Human fibroblast medium; KEGG: Kyoto encyclopedia of genes and genomes; KO: Knockout; lincRNA: long intergenic noncoding RNA; lncRNA: long noncoding RNA; Nt: Nucleotide; PCA: Principal component analysis; PPDE: Posterior probability of differential expression; qRT-PCR: quantitative reverse transcriptase polymerase chain reaction; RIN: RNA integrity; RNA-seq: RNA sequencing; snoRNA: small nucleolar RNA; TEC: To be experimentally confirmed; TLR: Toll-like receptor

Acknowledgements

Susan Carpenter encouraged us to perform sequencing and provided guidance on best practices. Breanne Haskins performed qRT-PCR for IncRNAs. Anthony Colombo assisted with quantitative analysis and was helpful for discussions. George Rosenburg and Melissa Sanchez, managers in the UNM CETI Molecular Biology Core Facility, assisted with performing the sequencing.

Authors' contributions

KLM designed the study, performed the experiments, analyzed the data, and wrote the manuscript. LB completed the computational analysis. EYD designed the study and wrote the manuscript. All authors have read and approved the manuscript.

Funding

This work was supported by grants from the National Institute of Allergy and Infectious Disease (Al139628) and the National Institute of General Medical Sciences (GM110907). The funders had no role in design, execution or interpretation of the study.

Availability of data and materials

The datasets generated and/or analysed during the current study are available in the NCBI Sequence Read Archive (SRA) repository, PRJNA695200 at https://www.ncbi.nlm.nih.gov/bioproject/695200. Reads were mapped to the annotated mouse genome release M21 from GenCode (GenBank assembly ID GCA_000001635.2) and *T. gondii* ME49 (GenBank Assembly ID GCA_000006565.2).

Ethics approval and consent to participate

All experimental protocols were approved by the University of New Mexico Institutional Animal Care and Use Committee (IACUC). The methods were carried out in accordance with the Panel on Euthanasia of the American Veterinary Medical Association.

Consent for publication

Not applicable.

Competing interests

The authors declare that they have no competing interests.

Received: 8 June 2020 Accepted: 11 February 2021 Published online: 23 February 2021

References

- Robert-Gangneux F, Darde ML. Epidemiology of and diagnostic strategies for toxoplasmosis. Clin Microbiol Rev. 2012;25(2):264–96.
- Dubey JP. The history and life-cycle of *Toxoplasma gondii*. In: Weiss LM, Kim K, editors. Toxoplasma gondii the model apicomplexan: perspective and methods. 2nd ed. San Diego: Academic Press; 2013. p. 1–17.
- Weiss LM, Kim K. The development and biology of bradyzoites of toxoplasma gondii. Front Biosci. 2000;5(1):D391–405.
- 4. McLeod RM, van Tubbergen C, Montoya JG, Petersen E. Human toxoplasma infection. In: Weiss LM, Kim K, editors. Toxoplasma gondii the model

- Apicomplexan: perspectives and methods. 2nd ed. San Diego: Academic Press; 2013. p. 100–59.
- Pfaff AW, Liesenfeld O, Candolfi E. Congenital toxoplasmosis. In: Ajioka JW, Soldati D, editors. *Toxoplasma* molecular and cellular biology. Norfolk: Horizon Bioscience; 2007. p. 93–110.
- Dupont CD, Christian DA, Hunter CA. Immune response and immunopathology during toxoplasmosis. Semin Immunopathol. 2012;34(6):793–813.
- Sasai M, Pradipta A, Yamamoto M. Host immune responses to toxoplasma gondii. Int Immunol. 2018;30(3):113–9.
- Scharton-Kersten TM, Wynn TA, Denkers EY, Bala S, Grunvald E, Hieny S, et al. In the absence of endogenous IFN-gamma, mice develop unimpaired IL-12 responses to toxoplasma gondii while failing to control acute infection. J Immunol. 1996;157(9):4045–54.
- Gazzinelli RT, Wysocka M, Hieny S, Scharton-Kersten T, Cheever A, Kuhn R, et al. In the absence of endogenous IL-10, mice acutely infected with *Toxoplasma gondii* succumb to a lethal immune response dependent upon CD4⁺ T cells and accompanied by overproduction of IL-12, IFN-g, and TNFa. J Immunol. 1996;157(2):798–805.
- Suzuki Y, Sher A, Yap G, Park D, Ellis Neyer L, Liesenfeld O, et al. IL-10 is required for prevention of necrosis in the small intestine and mortality in both genetically resistant BALB/c and susceptible C57BL/6 mice following peroral infection with *Toxoplasma gondii*. J Immunol. 2000;164:5375–82.
- Cohen SB, Maurer KJ, Egan CE, Oghumu S, Satoskar AR, Denkers EY. CXCR3dependent CD4(+) T cells are required to activate inflammatory monocytes for defense against intestinal infection. PLoS Pathog. 2013;9(10):e1003706.
- Dunay IR, Damatta RA, Fux B, Presti R, Greco S, Colonna M, et al. Gr1(+) inflammatory monocytes are required for mucosal resistance to the pathogen toxoplasma gondii. Immunity. 2008;29(2):306–17.
- 13. Dunay IR, Sibley LD. Monocytes mediate mucosal immunity to toxoplasma gondii. Curr Opin Immunol. 2010;22(4):461–6.
- Bierly AL, Shufesky WJ, Sukhumavasi W, Morelli A, Denkers EY. Dendritic cells expressing plasmacytoid marker PDCA-1 are Trojan horses during toxoplasma gondii infection. J Immunol. 2008;181(12):8445–91.
- Caamano J, Alexander J, Craig L, Bravo R, Hunter CA. The NF-kB family member RelB is required for innate and adaptive immunity to *Toxoplasma* gondii. J Immunol. 1999;163(8):4453–61.
- Cohen SB, Denkers EY. Impact of toxoplasma gondii on dendritic cell subset function in the intestinal mucosa. J Immunol. 2015;195(6):2754–62.
- Courret N, Darche S, Sonigo P, Milon G, Buzoni-Gatel D, Tardieux I. CD11c and CD11b expressing mouse leukocytes transport single *Toxoplasma* gondii tachyzoites to the brain. Blood. 2006;107(1):309–16.
- Sangare LO, Olafsson EB, Wang Y, Yang N, Julien L, Camejo A, et al. In vivo CRISPR screen identifies TgWIP as a toxoplasma modulator of dendritic cell migration. Cell Host Microbe. 2019;26(4):478–92 e8.
- Egan CE, Sukhumavasi W, Butcher BA, Denkers EY. Functional aspects of tolllike receptor/MyD88 signalling during protozoan infection: focus on toxoplasma gondii. Clin Exp Immunol. 2009.
- 20. Pifer R, Yarovinsky F. Innate responses to toxoplasma gondii in mice and humans. Trends Parasitol. 2011;27:388–93.
- Andrade WA, Souza MD, Ramos-Martinez E, Nagpal K, Dutra MS, Melo MB, et al. Combined action of nucleic acid-sensing toll-like receptors and TLR11/ TLR12 heterodimers imparts resistance to toxoplasma gondii in mice. Cell Host Microbe. 2013;13(1):42–53.
- Raetz M, Kibardin A, Sturge CR, Pifer R, Li H, Burstein E, et al. Cooperation of TLR12 and TLR11 in the IRF8-dependent IL-12 response to toxoplasma gondii profilin. J Immunol. 2013;191(9):4818–27.
- Yarovinsky F, Zhang D, Anderson JF, Bannenberg GL, Serhan CN, Hayden MS, et al. TLR11 activation of dendritic cells by a protozoan profilin-like protein. Science. 2005;308(5728):1626–9.
- Plattner F, Yarovinsky F, Romero S, Didry D, Carlier MF, Sher A, et al. Toxoplasma profilin is essential for host cell invasion and TLR11-dependent induction of an IL-12 response. Cell Host Microbe. 2008;3:1477–87.
- Gazzinelli RT, Mendonca-Neto R, Lilue J, Howard J, Sher A. Innate resistance against toxoplasma gondii: an evolutionary tale of mice, cats, and men. Cell Host Microbe. 2014;15(2):132–8.
- von Bernuth H, Picard C, Jin Z, Pankla R, Xiao H, Ku CL, et al. Pyogenic bacterial infections in humans with MyD88 deficiency. Science. 2008; 321(5889):691–6.
- von Bernuth H, Picard C, Puel A, Casanova JL. Experimental and natural infections in MyD88- and IRAK-4-deficient mice and humans. Eur J Immunol. 2012;42(12):3126–35.

Menard et al. BMC Genomics (2021) 22:130 Page 19 of 20

- Agliano F, Rathinam VA, Medvedev AE, Vanaja SK, Vella AT. Long noncoding RNAs in host-pathogen interactions. Trends Immunol. 2019;40(6):492–510.
- Menard KL, Haskins BE, Denkers EY. Impact of toxoplasma gondii infection on host non-coding RNA responses. Front Cell Infect Microbiol. 2019;9(1): 132.
- 30. Atianand MK, Caffrey DR, Fitzgerald KA. Immunobiology of long noncoding RNAs. Annu Rev Immunol. 2017;35(1):177–98.
- 31. Chen YG, Satpathy AT, Chang HY. Gene regulation in the immune system by long noncoding RNAs. Nat Immunol. 2017;18(9):962–72.
- 32. Araujo FG, Slifer T. Different strains of *Toxoplasma gondii* induce different cytokine responses in CBA/Ca mice. Infect Immun. 2003;71:4171–4.
- Gavrilescu LC, Denkers EY. IFN-gamma overproduction and high level apoptosis are associated with high but not low virulence toxoplasma gondii infection. J Immunol. 2001;167(2):902–9.
- Mordue DG, Monroy F, La Regina M, Dinarello CA, Sibley LD. Acute toxoplasmosis leads to lethal overproduction of Th1 cytokines. J Immunol. 2001;167(8):4574–84.
- Butcher BA, Fox BA, Rommereim LM, Kim SG, Maurer KJ, Yarovinsky F, et al. Toxoplasma gondii rhoptry kinase ROP16 activates STAT3 and STAT6 resulting in cytokine inhibition and arginase-1-dependent growth control. PLoS Pathoq. 2011;7(9):e1002236.
- Jensen KD, Wang Y, Wojno ED, Shastri AJ, Hu K, Cornel L, et al. Toxoplasma polymorphic effectors determine macrophage polarization and intestinal inflammation. Cell Host Microbe. 2011;9(6):472–83.
- Robben PM, Mordue DG, Truscott SM, Takeda K, Akira S, Sibley LD. Production of IL-12 by macrophages infected with toxoplasma gondii depends on the parasite genotype. J Immunol. 2004;172(6):3686–94.
- Patil V, Zhao Y, Shah S, Fox BA, Rommereim LM, Bzik DJ, et al. Co-existence of classical and alternative activation programs in macrophages responding to toxoplasma gondii. Int J Parasitol. 2014;44(2):161–4.
- Melo EJ, Carvalho TM, De Souza W. Behaviour of microtubules in cells infected with toxoplasma gondii. Biocell. 2001;25(1):53–9.
- Walker ME, Hjort EE, Smith SS, Tripathi A, Hornick JE, Hinchcliffe EH, et al. Toxoplasma gondii actively remodels the microtubule network in host cells. Microbes Infect. 2008;10(14–15):1440–9.
- Hosoi Y, Soma M, Shiura H, Sado T, Hasuwa H, Abe K, et al. Female mice lacking Ftx IncRNA exhibit impaired X-chromosome inactivation and a microphthalmia-like phenotype. Nat Commun. 2018;9(1):3829.
- Yang Y, Zhang J, Chen X, Xu X, Cao G, Li H, et al. LncRNA FTX sponges miR-215 and inhibits phosphorylation of vimentin for promoting colorectal cancer progression. Gene Ther. 2018;25(5):321–30.
- 43. Li Y, Guo D, Zhao Y, Ren M, Lu G, Wang Y, et al. Long non-coding RNA SNHG5 promotes human hepatocellular carcinoma progression by regulating miR-26a-5p/GSK3beta signal pathway. Cell Death Dis. 2018;9(9):888.
- Tong J, Ma X, Yu H, Yang J. SNHG15: a promising cancer-related long noncoding RNA. Cancer Manag Res. 2019;11(1):5961–9.
- Zanovello P, Vallerani E, Biasi G, Landolfo S, Colavo D. Monoclonal antibody against IFN-g inhibits Maloney murine sarcoma virus-specific cytotoxic T cell differentiation. J Immunol. 1988;140(4):1341–4.
- Zhang Y, Zhang D, Lv J, Wang S, Zhang Q. LncRNA SNHG15 acts as an oncogene in prostate cancer by regulating miR-338-3p/FKBP1A axis. Gene. 2019;705(1):44–50.
- Cai Y, Chen H, Jin L, You Y, Shen J. STAT3-dependent transactivation of miRNA genes following toxoplasma gondii infection in macrophage. Parasit Vectors. 2013;6(1):356.
- Rezaei F, Daryani A, Sharifi M, Sarvi S, Jafari N, Pagheh AS, et al. miR-20a inhibition using locked nucleic acid (LNA) technology and its effects on apoptosis of human macrophages infected by toxoplasma gondii RH strain. Microb Pathog. 2018;121(1):269–76.
- Hargrave KE, Woods S, Millington O, Chalmers S, Westrop GD, Roberts CW. Multi-Omics studies demonstrate toxoplasma gondii-induced metabolic reprogramming of murine dendritic cells. Front Cell Infect Microbiol. 2019; 9(1):309.
- Chan CW, Lee YB, Uney J, Flynn A, Tobias JH, Norman M. A novel member of the SAF (scaffold attachment factor)-box protein family inhibits gene expression and induces apoptosis. Biochem J. 2007;407(3):355–62.
- Carruthers V, Boothroyd JC. Pulling together: an integrated model of toxoplasma cell invasion. Curr Opin Microbiol. 2006;10(1):83–9.
- Del Rosario M, Periz J, Pavlou G, Lyth O, Latorre-Barragan F, Das S, et al. Apicomplexan F-actin is required for efficient nuclear entry during host cell invasion. EMBO Rep. 2019;20(12):e48896.

- He JJ, Ma J, Wang JL, Zhang FK, Li JX, Zhai BT, et al. Global Transcriptome profiling of multiple porcine organs reveals toxoplasma gondii-induced transcriptional landscapes. Front Immunol. 2019;10(1):1531.
- Melo MB, Nguyen QP, Cordeiro C, Hassan MA, Yang N, McKell R, et al. Transcriptional analysis of murine macrophages infected with different toxoplasma strains identifies novel regulation of host signaling pathways. PLoS Pathog. 2013;9(12):e1003779.
- Olson WJ, Martorelli Di Genova B, Gallego-Lopez G, Dawson AR, Stevenson D, Amador-Noguez D, et al. Dual metabolomic profiling uncovers toxoplasma manipulation of the host metabolome and the discovery of a novel parasite metabolic capability. PLoS Pathog. 2020;16(4):e1008432.
- Pittman KJ, Aliota MT, Knoll LJ. Dual transcriptional profiling of mice and toxoplasma gondii during acute and chronic infection. BMC Genomics. 2014;15(1):806.
- Tanaka S, Nishimura M, Ihara F, Yamagishi J, Suzuki Y, Nishikawa Y.
 Transcriptome analysis of mouse brain infected with toxoplasma gondii.
 Infect Immun. 2013;81(10):3609–19.
- Zhou CX, Elsheikha HM, Zhou DH, Liu Q, Zhu XQ, Suo X. Dual identification and analysis of differentially expressed transcripts of porcine PK-15 cells and toxoplasma gondii during in vitro infection. Front Microbiol. 2016;7(1):721.
- Zhou CX, Zhou DH, Liu GX, Suo X, Zhu XQ. Transcriptomic analysis of porcine PBMCs infected with toxoplasma gondii RH strain. Acta Trop. 2016; 154:82–8.
- 60. Gavrilescu LC, Denkers EY. IFN-g overproduction and high level apoptosis are associated with high but not low virulence *Toxoplasma gondii* infection. J Immunol. 2001;167:902–9.
- Mordue DG, Monroy F, La Regina M, Dinarello CA, Sibley LD. Acute toxoplasmosis leads to lethal overproduction of Th1 cytokines. J Immunol. 2001;167:4574–84.
- Saeij JP, Coller S, Boyle JP, Jerome ME, White MW, Boothroyd JC. Toxoplasma co-opts host gene expression by injection of a polymorphic kinase homologue. Nature. 2007;445(7125):324–7.
- Rosowski EE, Lu D, Julien L, Rodda L, Gaiser RA, Jensen KD, et al. Strainspecific activation of the NF-kappaB pathway by GRA15, a novel toxoplasma gondii dense granule protein. J Exp Med. 2011;208(1):195–212.
- Fuks JM, Arrighi RB, Weidner JM, Kumar Mendu S, Jin Z, Wallin RP, et al. GABAergic signaling is linked to a Hypermigratory phenotype in dendritic cells infected by toxoplasma gondii. PLoS Pathog. 2012;8(12):e1003051.
- 65. Liu W, Huang L, Wei Q, Zhang Y, Zhang S, Zhang W, et al. Microarray analysis of long non-coding RNA expression profiles uncovers a toxoplasma-induced negative regulation of host immune signaling. Parasit Vectors. 2018;11(1):174.
- Rochet E, Appukuttan B, Ma Y, Ashander LM, Smith JR. Expression of long non-coding RNAs by human retinal Muller glial cells infected with clonal and exotic virulent toxoplasma gondii. Non-coding RNA. 2019;5(4):48.
- Menard KL, Haskins BE, Colombo AP, Denkers EY. Toxoplasma gondii manipulates expression of host long noncoding RNA during intracellular infection. Sci Rep. 2018;8(1):15017.
- Fitzgerald KA, Caffrey DR. Long noncoding RNAs in innate and adaptive immunity. Curr Opin Immunol. 2014;26(1):140–6.
- Scanga CA, Aliberti J, Jankovic D, Tilloy F, Bennouna S, Denkers EY, et al. Cutting edge: MyD88 is required for resistance to *Toxoplasma gondii* infection and regulates parasite-induced IL-12 production by dendritic cells. J Immunol. 2002;168:5997–6001.
- Croken MM, Ma Y, Markillie LM, Taylor RC, Orr G, Weiss LM, et al. Distinct strains of toxoplasma gondii feature divergent transcriptomes regardless of developmental stage. PLoS One. 2014;9(11):e111297.
- Kim L, Butcher BA, Denkers EY. Toxoplasma gondii interferes with lipopolysaccharide-induced mitogen-activated protein kinase activation by mechanisms distinct from endotoxin tolerance. J Immunol. 2004;172(5):3003–10.
- Frankish A, Diekhans M, Ferreira AM, Johnson R, Jungreis I, Loveland J, et al. GENCODE reference annotation for the human and mouse genomes. Nucleic Acids Res. 2019;47(D1):D766–D73.
- 73. Dobin A, Davis CA, Schlesinger F, Drenkow J, Zaleski C, Jha S, et al. STAR: ultrafast universal RNA-seq aligner. Bioinformatics. 2013;29(1):15–21.
- Liao Y, Smyth GK, Shi W. featureCounts: an efficient general purpose program for assigning sequence reads to genomic features. Bioinformatics. 2014;30(7):923–30.
- Leng N, Dawson JA, Thomson JA, Ruotti V, Rissman Al, Smits BM, et al. EBSeq: an empirical Bayes hierarchical model for inference in RNA-seq experiments. Bioinformatics. 2013;29(8):1035–43.

Menard et al. BMC Genomics (2021) 22:130 Page 20 of 20

- 76. Tange O. GNU parallel: the command-line power. USENIX Mag. 2011;36(1): 42–7.
- 77. Team RC. R: a language and environment for statistical computing; 2014.
- Gentleman RC, Carey VJ, Bates DM, Bolstad B, Dettling M, Dudoit S, et al. Bioconductor: open software development for computational biology and bioinformatics. Genome Biol. 2004;5(10):R80.
- 79. Wickham H. ggplot: Elegant Graphics for Data Analysis Springer; 2016.
- 80. Wickham H. reshape2: Flexibly reshape data: a reboot of the reshape package. R Packag. Version. ed; 2012.
- 81. Kolde R. Pheatmap: pretty heatmaps. R Packag. Version 61, 915 ed; 2012.
- 82. Varet H, Brillet-Gueguen L, Coppee JY, Dillies MA. SARTools: a DESeq2- and EdgeR-based R pipeline for comprehensive differential analysis of RNA-Seq data. PLoS One. 2016;11(6):e0157022.
- 83. Raudvere U, Kolberg L, Kuzmin I, Arak T, Adler P, Peterson H, et al. G:profiler: a web server for functional enrichment analysis and conversions of gene lists (2019 update). Nucleic Acids Res. 2019;47(W1):W191–W8.
- 84. Gajria B, Bahl A, Brestelli J, Dommer J, Fischer S, Gao X, et al. ToxoDB: an integrated toxoplasma gondii database resource. Nucleic Acids Res. 2008; 36(Database issue):D553–6.

Publisher's Note

Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.

Ready to submit your research? Choose BMC and benefit from:

- fast, convenient online submission
- thorough peer review by experienced researchers in your field
- rapid publication on acceptance
- support for research data, including large and complex data types
- gold Open Access which fosters wider collaboration and increased citations
- maximum visibility for your research: over 100M website views per year

At BMC, research is always in progress.

Learn more biomedcentral.com/submissions

