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The Golgi Glycoprotein MGAT4D is an Intrinsic Protector of Testicular Germ Cells From Mild Heat Stress

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Male germ cells are sensitive to heat stress and testes must be maintained outside the body for optimal fertility. However, no germ cell intrinsic mechanism that protects from heat has been reported. Here, we identify the germ cell specific Golgi glycoprotein MGAT4D as a protector of male germ cells from heat stress. *Mgat4d* is highly expressed in spermatocytes and spermatids. Unexpectedly, when the *Mgat4d* gene was inactivated globally or conditionally in spermatogonia, or mis-expressed in spermatogonia, spermatocytes or spermatids, neither spermatogenesis nor fertility were affected. On the other hand, when males were subjected to mild heat stress of the testis (43 °C for 25 min), germ cells with inactivated *Mgat4d* were markedly more sensitive to the effects of heat stress, and transgenic mice expressing *Mgat4d* were partially protected from heat stress. Germ cells lacking *Mgat4d* generally mounted a similar heat shock response to control germ cells, but could not maintain that response. Several pathways activated by heat stress in wild type were induced to a lesser extent in *Mgat4d*[-/-] heat-stressed germ cells (NFKB response, TNF and TGF β signaling, *Hif1* α and *Myc* genes). Thus, the Golgi glycoprotein MGAT4D is a novel, intrinsic protector of male germ cells from heat stress.

MGAT4D is designated family member D of the MGAT4 gene family by the Human Genome Nomenclature Committee based on sequence similarity to other members, including MGAT4A and MGAT4B. The latter are N-acetylglucosaminyltransferases (GlcNAcTs) that add a \\beta1, 4GlcNAc to complex N-glycans. However, when MGAT4D is transfected into cultured cells, it does not appear to have GlcNAcT activity. Rather, it inhibits MGAT1 activity, the GlcNAcT responsible for initiating complex N-glycan synthesis¹. Because of this inhibitory activity, the protein was termed GnT1IP for GlcNAcT1 Inhibitory Protein. The Mgat4d gene is highly expressed in mouse testis with little expression in other mouse tissues². Based on RNA-seq analysis, it is expressed in spermatocytes and spermatids, but not in spermatogonia, sperm or Sertoli cells³. MGAT4D is the most abundant protein in purified Golgi from rat testis germ cells⁴. Characterization of the interactions of MGAT4D in the Golgi using a fluorescence resonance energy transfer (FRET) assay showed that it interacts with MGAT1 but not MGAT2, MGAT3, MGAT4B or MGAT5³. Since knockout of Mgat1 in spermatogonia disrupts spermatogenesis and results in infertility^{5,6}, deletion or overexpression of Mgat4d in germ cells were both expected to have effects on spermatogenesis. In this paper, we show that unexpectedly, deletion of Mgat4d globally, or specifically in spermatogonia, or mis-expression of Mgat4d in spermatogonia, spermatocytes or spermatids, do not appear to alter spermatogenesis in young or aged mice, and do not affect fertility. However, mild heat stress of the testis in aged mice revealed that germ cells lacking Mgat4d exhibited more damage and apoptosis following heat stress. By contrast, a Mgat4d transgene expressed in spermatogonia, spermatocytes or spermatids, conferred partial resistance to mild heat stress. This is the first report of a germ cell intrinsic molecule that protects germ cells from heat stress and a novel function for a Golgi glycoprotein. Gene expression analyses showed that germ cells lacking Mgat4d responded to heat stress by initially upregulating heat shock and related genes. However, in contrast to controls, germ cells lacking Mgat4d did not sustain this response, nor upregulate anti-inflammatory and anti-apoptotic

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Figure 1. Generation of Mgat4d mutant mice. (A) Map of the targeted $Mgat4d^{\text{tm1a}(\text{KOMP})\text{Wisi}}$ allele in ES cells obtained from KOMP. Exon 4 is flanked by two loxP sites. LacZ and the neomycin cassettes are flanked by two Frt sites. (B) PCR of genomic DNA from Mgat4d[+/+], Mgat4d[+/-], Mgat4d[-/-] and Mgat4d[F/-]:Stra8-iCre pups to determine genotype. Primers are given in Supplementary Table S1. (C) Western blot analysis of protein extracts of germ cells purified from 28 dpp Mgat4d[+/+], Mgat4d[+/-] and Mgat4d[-/-] mice. Long and short forms of MGAT4D are identified. *is a non-specific band. Full blot in Supplementary Fig. S1. (D) Representative testis section from a mouse carrying the *LacZ* gene under the control of the Mgat4d promoter after staining for β -galactosidase (blue). Nuclei were stained with eosin. (E) Immunohistochemistry of representative testis sections from Mgat4d[+/-] and Mgat4d[-/-] mice of 28 dpp. The presence of MGAT4D is shown by the brown stain consistent with a Golgi localization (arrows). Nuclei were stained with hematoxylin.

protective genes to the same degree as wild type germ cells. The data identify a new function for MGAT4D as a protector of male germ cell homeostasis, and provide new insight into how male germ cells withstand heat stress.

Results

Effects of global and conditional deletion of Mgat4d on spermatogenesis and fertility. Embryonic stem cells (ES Cells) carrying the construct Mgat4d^{tm1a(KOMP)Wtsi} designed to conditionally delete exon 4 of the Mgat4d gene (Fig. 1A) were obtained from the Knockout Mouse Project (KOMP) repository. Following injection into C57BL/6J blastocysts, chimeras were crossed to C57BL/6J to obtain mice carrying the conditional Mgat4d^{tm1a(KOMP)Wtsi} allele. Male progeny were crossed with FVB Stra8-iCre⁷ or Flp1-Cre transgenic females (129S4/SvJaeSor-Gt(ROSA)26Sor^{4m1(FLP1)Dym}/J)⁸. Stra8 is expressed in spermatogonia from 3 days post-partum (dpp) and the *Flp1*-Cre was expressed from the ROSA26 locus. Male mice with global (Mgat4d[-/-]) or conditional (Mgat4d[F/F]:Stra8-iCre) inactivation of the Mgat4d gene were generated, and males expressing LacZ from the Mgat4d promoter were also obtained (Fig. 1A). Both strains were crossed to FVB mice and maintained on a FVB background because Mgat1 deletion was performed on the FVB background⁵. Genotyping PCR identified Mgat4d[+], Mgat4d[-], Mgat4d[F] alleles and Stra8-iCre (Fig. 1B). Primer sequences, locations and expected product sizes are given in Supplementary Table S1. Polyclonal rabbit antibodies (pAb) prepared against a C-terminal peptide of MGAT4D identified the long form (MGAT4D-L) and the short form (MGAT4D-S) which lacks 44 amino acids at the N-terminus of MGAT4D-L, and mice with inactivated Mgat4d had no signal, as expected (Fig. 1C). Detection of LacZ expression by beta-galactosidase activity showed that the Mgat4d promoter is active mostly in spermatocytes and spermatids in testis tubules (Fig. 1D), consistent with results of RNA-seq analysis³. Immunohistochemistry for MGAT4D in testis sections from Mgat4d[+/-] or wild type males shows staining in a Golgi-like organelle in spermatocytes and round spermatids, but not in Sertoli cells, spermatogonia or spermatozoa (Fig. 1E). Similar experiments in rat testis showed GL54D/MGAT4D to have the same expression pattern as several established Golgi markers⁴. We show in Supplementary Fig. S3C that antibodies to the Golgi marker GM130 co-localized with MGAT4D in mouse germ cells. Testis sections from Mgat4d[-/-] males showed no staining, as expected (Fig. 1E).

Mouse strain	Male genotype	No. males	No. litters	No. pups	<i>Mgat4d</i> [-/-]	<i>Mgat4d</i> [+/-]	Transmission (CHI squared)
FVB	Mgat4d[-/-]	5	5	54	29	25	0.586
C57BL/6J	Mgat4d[-/-]	4	13	88	42	46	0.669
C57BL/6J	Mgat4d[F/F]: Stra8-iCre	2	9	59	29	30	0.896
					Mgat4d-L-Myc	Mgat4d[+/+]	
C57BL/6J	Stra8-Mgat4d-L-Myc	7	20	171	70	101	0.018
C57BL/6J	Ldhc-Mgat4d-L-Myc	4	9	59	26	33	0.362
C57BL/6J	Prm1-Mgat4d-L-Myc	6	12	77	41	36	0.568

Table 1. Fertility of Mgat4d[-/-] and Mgat4d-L-Myc transgenic male mice. Mgat4d[-/-] males were crossedwith Mgat4d[+/-] females. Mgat4d[F/F]:Stra8-iCre] males were crossed with Mgat4d[F/-] females. Mgat4d-L-Myc transgenic heterozygote males were crossed with Mgat4d[+/+] females. Stra8-Mgat4d-L-Myc malestransmitted the transgene significantly less often than expected based on Mendelian inheritance.

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Mgat4d[-/-] males and females were fertile and transmitted the inactivated gene according to the expected Mendelian distribution (Table 1). Male mice with conditional deletion of Mgat4d in spermatogonia also showed no defects in fertility on a FVB background, or after backcrossing 10 generations to C57BL/6J mice (Table 1). Based on histological analyses, testicular weight and analysis of sperm parameters (sperm count, viability, morphology, motility and acrosome reaction), no obvious defects in spermatogenesis were observed in Mgat4d[-/-] males. In addition, aging (up to 596 dpp for FVB and 482 dpp for C57BL/6J) did not reveal apparent histological differences in spermatogenesis between mutant and control males (data not shown).

As discussed in the Introduction, MGAT4D was initially described as an inhibitor of MGAT1 activity and termed GnT1IP¹. By deleting such an inhibitor, we expected MGAT1 activity might increase, and the level of complex N-glycans on glycoproteins might also increase. We determined MGAT1 GlcNAc transferase activity in germ cell extracts. Germ cells were purified from 28 dpp C57BL/6J wild type (n = 4) and *Mgat4d*[-/-] males (n = 4) and protein extracts prepared. The average activity for Mgat4d[+/+](1.86+/-0.38 nmol/mg/hr) and for Mgat4d[-/-](1.68 +/-0.32 nmol/mg/hr) were not significantly different (p = 0.72). This result might reflect the fact that Mgat1 is most highly expressed in spermatogonia, which do not express $Mgat4d^3$. However, there was an increase in certain oligomannosyl and complex N-glycan species in Mgat4d[-/-] testis sections examined by MALDI mass spectrometry imaging (MALDI-IMS) (Supplementary Fig. S2A, S2B, S2C) indicative of a disturbance in N-glycan synthesis in Mgat4d[-/-] germ cells. The fact that the complement of more highly branched N-glycan species was not increased in Mgat4d KO testis is consistent with findings from an activated allele of MGAT1 that predisposes to multiple sclerosis⁹.

Males lacking *Mgat4d* **are more sensitive to mild heat stress of the testis.** Given the apparent lack of significant consequences for spermatogenesis of removing *Mgat4d*, we investigated whether stressing testicular germ cells would reveal any effects of *Mgat4d* loss. Spermatogenesis is sensitive to an increase in temperature^{10,11} and we reasoned that disturbing tissue homeostasis using mild heat stress might reveal roles for MGAT4D in testis. The remaining cohort of aged Mgat4d[+/-] and Mgat4d[-/-] FVB mice of between 592 and 596 dpp were anesthetized and subjected to mild heat stress by immersing the lower half of the body in water at 43 °C for 25 min. Mock treatment involved the same procedure with a water temperature of 33 °C. After recovery for 24 hr, testes were harvested. Similar protocols have previously been used to investigate heat stress in mouse testes¹¹⁻¹³. One testis was used for histological analysis and the other for RNA and protein extraction. While testis sections from males treated at 33 °C appeared normal, 43 °C treatment caused the appearance of enlarged ($\geq 10 \mu$ m) multinucleated cells, large vacuoles ($\geq 10 \mu$ m), small vacuoles and pyknotic cells in testis tubules (Fig. 2A). Spermatozoa in the epididymis also included pyknotic cells following heat stress (Fig. 2B). Compared to controls, *Mgat4d*[-/-] testis sections exhibited an increased number of tubules (~3.5-fold) with enlarged cells, and a decrease in undamaged tubules (~2-fold). (Fig. 2C). No significant difference was found in testis weights of heat-treated versus control mice (Supplementary Table S2).

Heat stress increases apoptosis in differentiating germ cells^{11,12,14} and so testis sections from heat- and mock-treated aged FVB males were subjected to the "Apoptag" assay and staining was quantified using FIJI software (https://fiji.sc/). As expected, apoptosis increased in sections from control heat-treated males sacrificed 24 hr after heat treatment (Fig. 3A,B). However, testes from Mgat4d[-/-] mice showed ~2-fold more apoptotic germ cells than Mgat4d[+/-] controls (Fig. 3C,D). Thus, based on histology and levels of apoptosis, the effects of heat stress were more severe for aged Mgat4d[-/-] testes than for heterozygous testes.

Mgat4d transgenic mice are resistant to the effects of heat stress. Mice with targeted deletion of *Mgat1* in testicular germ cells exhibit defective spermatogenesis and are infertile⁵. Thus, it was expected that inhibiting MGAT1 activity by increasing the level of MGAT4D in germ cells, would induce defects in mouse spermatogenesis. To investigate, C57BL/6J transgenic males expressing a *Mgat4d-L-Myc* cDNA in specific germ cell types were generated. This transgene has previously been shown to inhibit MGAT1 in transfected cells^{1,3}. The *Stra8* (Stimulated By Retinoic Acid 8) promoter was used to express the transgene in spermatogonia⁵⁻⁷, the *Ldhc* (Lactate Dehydrogenase C) promoter was used to express in spermatocytes^{15,16}, and the *Prm1* (Protamine 1) promoter was used to express in spermatids¹⁷ (Fig. 4A). The transgenic mouse strains were named *Stra8-Mgat4d-L-Myc*, *Ldhc-Mgat4d-L-Myc* and *Prm1-Mgat4d-L-Myc*, respectively. They were genotyped by PCR





of genomic DNA using primers described in Supplementary Table S1, and transgene expression was shown to be 3-6-fold greater than endogenous Mgat4d-L levels using quantitative RT-PCR (qRT-PCR) on cDNA from testis (Fig. 4B). qRT-PCR using primers specific for the Myc sequence gave a similar level of expression based on Ct values, whereas no product was obtained from wild type (not shown). Myc transcripts could not be quantitated relative to the control that had no transgene. By contrast, attempts to determine MGAT4D-L-Myc protein levels in testis extracts by western blot analysis using anti-Myc monoclonal antibodies (mAb) from several species were not successful, although MGAT4D-L-Myc overexpressed in CHO cells is detected by anti-Myc mAb³. We generated C- and N-terminal peptide-purified rabbit pAbs that detect MGAT4D-L-Myc or Myc-MGAT4D-L, respectively, in transfected CHO cells (Supplementary Fig. S3A, S3B). The C-terminal pAb detected Myc-MGAT4D-L much more readily than MGAT4D-L-Myc (Supplementary Fig. S3A, S3B). However, MGAT4D-L-Myc was not detected in extracts from transgenic germ cells (Supplementary Fig. S3B). Overexpression or mis-expression of Mgat4d in germ cells was expected to inhibit MGAT1 activity^{1,3}. However, compared to Mgat4d[+/+] controls (1.1 + -0.13 nmol/mg/hr; n = 10), there was no significant inhibition of MGAT1 activity in germ cells from 28-42 dpp Stra8-Mgat4d-L-Myc (1.4+/-0.16 nmol/mg/hr; n = 7), Ldhc-Mgat4d-L-Myc (0.78+/-0.18 nmol/ mg/hr; n = 4), Prm1-L-Mgat4d (1.3 +/-0.03 nmol/mg/hr; n = 4). Moreover, MALDI-IMS of testis sections showed no significant increase in the oligomannosyl substrate of MGAT1 in Mgat4d transgenic testis sections (Supplementary Fig. S2D), consistent with the MGAT1 activity assay results. Importantly, however, the experiments that follow show that each transgene was functional in protecting germ cells from mild heat stress.

Histological analysis of testis sections showed no obvious changes in spermatogenesis or testicular structure in adult transgenic mice (Fig. 4C). In addition, the fertility of transgenic males was normal, although *Stra8-Mgat4d-L-Myc* mice showed low transgene transmission from transgenic males (Table 1). Males from the



Figure 3. Apoptosis of germ cells in heat-treated testes. Representative testis sections from 33 °C- or 43 °C-treated aged FVB males were subjected to the TUNEL "Apoptag" assay for *in situ* detection of DNA strand breaks. (A) Section from a 33 °C-treated *Mgat4d*[-/-] male. (B) Section from a 43 °C-treated *Mgat4d*[+/-] male. (C) Section from a 43 °C-treated *Mgat4d*[-/-] male. DNA breaks stained brown (red arrows). (D) quantification of apoptotic signal in \geq 100 tubules using FIJI software. Student's t test (unpaired, two-tailed) *p < 0.05.

three transgenic mouse strains and non-transgenic littermates or wild type C57BL/6J controls were subjected to mild heat stress. No significant difference was observed in testis weights of mock- versus heat-treated mice (Supplementary Table S2). Importantly, however, each transgenic strain showed an ~3-fold reduction in the number of tubules with enlarged germ cells, and ~2-fold fewer tubules with large vacuoles (Fig. 5A). The number of undamaged tubules was also increased but small vacuoles and pyknotic cells were present in heat-treated transgenic mice (Fig. 5B–D). The "Apoptag" assay revealed an ~2-fold reduction in apoptotic germ cells in all three transgenic strains (Fig. 6A,B). We also investigated previously reported gene expression changes due to heat stress. In wild type males, *Socs3*, *Hspa1a* and *Degs1* were up-regulated, while *Bcl2l12*, *Crbg3* and *Dmrt1* were down-regulated after heat treatment (Fig. 7), consistent with previous observations^{14,18}. Interestingly, *Mgat4d* was markedly down-regulated following heat treatment (Fig. 7). Gene expression in heat treated *Stra8-Mgat4d-Myc* males was similar to that in non-transgenic males at 33 °C, up-regulated genes being less up-regulated and down-regulated genes, less down-regulated compared to non-transgenic at 43 °C (Fig. 7). Thus, on the basis of several criteria, the presence of a *Mgat4d-L-Myc* transgene in germ cells gave significant protection from heat stress.

Molecular basis of the increased sensitivity of Mgat4d[-/-] germ cells to heat stress. The histological and apoptotic changes induced by heat stress reported above were observed in an aged cohort of 1.6-year FVB mice. We subsequently tested 7 month C57BL/6J Mgat4d[-/-] mice and did not observe increased sensitivity to heat stress. However, protection from heat stress was observed in adult C57BL/6J transgenic mice as shown here. Thus, to determine whether Mgat4d[-/-] mice on a C57BL/6J background exhibited a more sensitive response to heat stress than controls, and to also gain insights into molecular mechanisms that underlie this phenotype, microarray analyses were performed on cDNA from purified germ cells of control and Mgat4d[-/-] C57BL/6J mice of ~2 months. Mgat4d[+/+] and Mgat4d[-/-] males were treated at 33 °C or 43 °C for 25 min and sacrificed after 8 hr, a time when no visible histological changes to germ cells were observed (data not shown). Testes were enzymatically dissociated and germ cells were isolated and counted. RNA preparations with a RIN value > 7.9 were used to make cDNA for microarray analysis. Purity of germ cells was assessed by relative expression of germ cell-specific and non-germ cell genes to the same genes expressed in testis RNA as previously



Figure 4. Generation and characterization of *Mgat4d* transgenic mice. (**A**) Schematic representation of constructs used to generate transgenic (Tg) mice. Expression of *Mgat4d-L-Myc* was driven by promoters (*Stra8*, *Ldhc* and *Prm1*) specific for different germ cell types. Lower diagram, position of primers used for qRT-PCR amplification. "LongFw" and "LongRev" to amplify the 5' region of Mgat4d-L; "TrFw" and "TrRev" to amplify the transgene junction. (**B**) qRT-PCR of *Mgat4d-L* 5' primer transcripts relative to *Actb* and *Rps2*. Testis RNA was isolated from males of 28 dpp. (**C**) Representative H&E stained testis sections from 120 dpp control and *Mgat4d-L-Myc* transgenic males.

described⁶. The Mouse ClariomTM D GeneChipTM Mouse Transcriptome Array 1.0 from Affymetrix was used. Custom scripts using the R/Bioconductor tools affymetrix and limma were used to process the raw (.CEL) files and to compare Mgat4d[-/-] versus Mgat4d[+/+] microarray data from 33 °C- and 43 °C-treated mice. The samples displayed a moderate clustering by genotype, as seen in PCA plots (Fig. 8A). Importantly, significant differences between genotypes were much less pronounced at 33 °C than at 43 °C, as witnessed by the tighter correlation in the heat maps, and a lower number of differentially expressed genes (DEGs) between genotypes shown in volcano plots (Fig. 8B). However, a clear difference was evident between wild type and Mgat4d[-/-] arrays from germ cells of mice treated at 43 °C. Given the importance of the temperature as a confounding variable, it was included in modeling differential gene expression between genotypes (Fig. 8C). DEGs in mutant versus wild type germ cells at 33 °C and at 43 °C were determined, and the interaction between temperature and genotype was evaluated to obtain gene lists for further analysis. Microarray data are deposited in NCBI's Gene Expression Omnibus (GEO) and are accessible through GEO serial accession number GSE137307.

Analysis of 33 °C Mgat4d[-/-] versus control microarrays with FDR < 0.05 and fold change +/-1.5 gave 4 DEGs (3 up- and 1 down-regulated gene), including Mgat4d as expected. Mgat4d transcripts were not completely lacking in Mgat4d[-/-] samples due to transcription beyond the deleted exon 4 (Supplementary Fig. S4). However, no MGAT4D protein was detected by western analysis or immunohistochemistry (Fig. 1, Supplementary Fig. S1 and S2B). One of the up-regulated genes, pseudogene Gm12584, maps to the locus of a testis-specific gene, adenosine deaminase domain-containing 1 (Adad1), which encodes a nuclear RNA-binding protein¹⁹. Upregulated Gm24265 refers to an SnRNA mapped to chromosome 5. The third up-regulated gene was Tmed6 (Transmembrane P24 Trafficking Protein 6) which is enriched in the endoplasmic reticulum and Golgi compartments. It is notable that all the upregulated DEGs have a log fold change <1 (fold change <2), revealing a very mild effect of Mgat4d deletion on germ cell gene expression under control conditions (Supplementary Table S3). By contrast, analysis using the same stringency for data from heat-stressed Mgat4d[-/-] versus control germ cells, revealed 476 DEGs in Mgat4d[-/-] germ cells with 110 genes up-regulated and 366 genes down-regulated. The top down-regulated genes were Serpinb1a (2.13 log fold change) followed by Ly96 (2.12 Log fold change) and S100-a11 (2.09 Log fold change) (Supplementary Table S4). Some of the down-regulated genes (Serpinb1a, Star, Osr2, Klk1b22, Itih2) are related to the regulation of cellular homeostasis, proliferation or survival²⁰⁻²⁵. The top two up-regulated genes were non-coding Gm26715 and Gm48565 (2.04 and 1.98 log fold change respectively), followed by Hspa1a and Hspa1b heat shock proteins (1.81 and 1.75 log fold change, respectively). Most of the up-regulated genes were non-coding or predicted genes (Supplementary Table S5). cDNA



Figure 5. Effects of heat stress in *Mgat4d* transgenic testis. Quantification of heat-induced damage in testes of *Mgat4d*[+/+] (n = 5), *Stra8-Mgat4d-L-Myc* (n = 8), *Ldhc-Mgat4d-L-Myc* (n = 7), and *Prm1-Mgat4d-L-Myc* (n = 5) C57BL6/J males. 30 tubules were investigated per mouse in one H&E stained testis section to detect (**A**) Enlarged germ cells; (**B**) Large vacuoles; (**C**) Small vacuoles, pyknotic cells; (**D**) Undamaged tubules. Differences from control two- tailed, unpaired Student t-test *p < 0.05, **p < 0.01.

from the 43 °C-treated control and Mgat4d[-/-] cDNA preparations was used for qRT-PCR validation of DEGs observed in microarray experiments (Fig. 9A,B). The relevant primer sequences are given in Supplementary Table S6.

Enriched biological pathways in heat-stressed Mgat4d[-/-] germ cells based on Ingenuity Pathway Analysis (IPA). To find the most significantly represented pathways differentially altered in Mgat4d[-/-] versus Mgat4d[+/+] germ cells following heat stress, we examined the relationship between DEGs at a ±1.5 fold change with adjusted FDR < 0.05 and p < 0.05 using IPA. Interestingly, the top canonical pathways were mostly down-regulated or with "no activity pattern available" in 43 °C-treated Mgat4d[-/-] versus control germ cells, and were related to recovery from stress conditions (Fig. 9C). Ranked by $-\log(p-value)$, the top down-regulated pathway was Acute Phase Response Signaling (p = 5.2; Z-score -2.45) followed by LXR/RXR Activation (p = 5.04; Z-score 0.707), the only pathway with a positive z-score and $-\log(p-value)$ higher than 2. NRF2-mediated Oxidative Stress Response (p = 4.98; Z-score -2.111) and Glutathione-mediated Detoxification (p = 3.37; Z-score -2) were also top pathways.

Top upstream transcriptional regulators. IPA was used to predict the top upstream transcriptional regulators in the DEGs based on their gene targets. The algorithm calculates a p-value on the basis of significant overlap between genes in our test dataset and target genes regulated by the same regulator in the IPA knowledge base. The activation Z score algorithm was used to make predictions. This analysis identified 323 upstream regulators with a p-value of overlap <0.05 and a Z-score greater than or equal to +/-2. *Tgfb1*, *Tnf*, *Ifng*, *Il1b* related to immune system regulation are the top inhibited upstream regulators (Supplementary Table S7). Sorting the results by Expression Log Ratio +/-1, identified 13 differentially-expressed upstream regulators in our data set, 11 down-regulated and 2 up-regulated (Supplementary Table S7).

Most represented networks, toxicological functions, diseases and biological functions. DEGs in germ cells from heat-treated mice were compared by IPA with genes belonging to specific biological networks or implicated in diseases. The most highly ranked network was "DNA Replication, Recombination, and Repair,





Nucleic Acid Metabolism, Small Molecule Biochemistry" with 28 focus molecules (Supplementary Table S8). The top diseases and biological functions were related to "Organismal Survival" – 19 biological functions were predicted to be increased with an activation Z-score between 6.131 and 2.01, mostly related to inflammation, injury and disease (Supplementary Table S9) but a higher number of diseases or functions were predicted to be decreased (71). The top category was "Lipid Metabolism, Small Molecule Biochemistry, Vitamin and Mineral Metabolism" and the most represented of these were related to cellular function.

Gene set enrichment analysis (GSEA). Comparisons of DEGs at 33 °C and 43 °C with published, classified gene sets in the MSigDB was performed using GSEA^{26–28}. Of the eight categories of gene sets, the Hallmark collection summarizes well-defined biological processes and states from v4.0 MSigDB collections C1 through C6²⁹. Hallmark gene sets with a Normalized Enrichment Score (NES) of +/-2, FDR < 0.25 and p < 0.05 were examined. In Mgat4d[-/-] germ cells, only 3 Hallmark gene sets were significantly enriched at 43 °C - E2F targets, G2M checkpoint and spermatogenesis. The Hallmark Spermatogenesis gene set contains genes upregulated during the process of spermatogenesis, indicating that loss of Mgat4d in heat-stressed germ cells leads to induction of spermatogenesis-promoting genes as a response, whereas germ cells expressing Mgat4d were comparatively protected from premature upregulation of these genes (Supplementary Fig. S5A, S5C). Gene sets enriched in Mgat4d[+/+] germ cells at 43 °C were related to immune pathways signaling, inflammatory responses, apoptosis and hypoxia (Supplementary Fig. S5B).

Gene sets of note in other collections were: negative regulation of extrinsic apoptosis signaling (suppression of apoptosis) by Mgat4d in the C5 collection; increased inflammatory response and TNF targets up in Mgat4d[+/+] germ cells in the C2 collection; late ATM-dependent genes induced by radiation up in Mgat4d[+/+]; increased induction in Mgat4d[-/-] of MYBL1 target genes in spermatocytes; and genes downregulated in response to gamma-radiation were up in Mgat4d[-/-]. We also investigated DEGs in wild type versus mutant at 43 °C versus 33 °C using EnrichR³⁰. Heat maps highlight some of the informative EnrichR gene sets and also show illustrative



Figure 7. qRT-PCR of cDNA from testis of 33 °C- or 43 °C-treated control vs *Stra8-Mgat4d-L-Myc* males of 7 months. Testes were isolated 24 hr after treatment. qRT-PCR was performed in triplicate. Relative gene expression was normalized to *Actb* and *Rps2*. Mean \pm SEM; statistical analysis by two-tailed, unpaired Student's t-test.; *p < 0.05, **p < 0.01, ***p < 0.001, ****p < 0.001.

gene expression differences identified (Fig. 10A,B). The overall results suggest that Mgat4d[-/-] germ cells have a problem responding to heat shock stress, e.g. coping with hyperthermic stress through clearance of damaged proteins (*Casp8*; Fig. 10B). A number of pathways and genes were induced to a lesser extent in Mgat4d[-/-]heat-stressed mice, including $Hif1\alpha$, the NF κ B response, pro-inflammatory pathways such as TNF and TGF β signaling, and genes that promote proliferation such as Myc (Fig. 10B).

Discussion

In this paper we characterize the first germ cell intrinsic molecule that protects from heat stress - the Golgi glycoprotein MGAT4D. Other molecules that protect germ cells from heat stress have been described, but each was overexpressed in testis under an exogenous promoter^{31,32}. MGAT4D maps to mouse chromosome 8 whereas previous genetic loci linked to germ cell resistance to heat stress map to mouse chromosomes 1 and 11³³. Global deletion of the ion channel Trpv1 increases the sensitivity of germ cells to heat stress³⁴, and this gene maps to chromosome 11, albeit 5.5cM away from the heat resistant locus on chromosome 11³³. However, it is not clear which cells of the testis express Trpv1 which is most highly expressed elsewhere in dorsal root ganglia. Mgat4d is most highly expressed in spermatocytes and spermatids³ and thus well positioned to protect germ cells from heat stress. Detailed analysis of rat MGAT4D/GL54D showed it is expressed from Pachytene to stage 16 of tubular development⁴. Here we provide several pieces of evidence in support of a germ cell protective role for Mgat4d. First, we show that an old cohort of Mgat4d[-/-] males were more sensitive to mild testicular heat stress than heterozygote controls, as evidenced by increased germ cell defects and apoptosis at 24 hr after heat stress. Second, we found that mice expressing a Mgat4d-L-Myc transgene in either spermatogonia (Stra8 promoter), spermatocytes (Ldhc promoter) or spermatids (Prm1 promoter) were less sensitive to testicular heat stress than wild type controls, based on reduced germ cell defects and reduced apoptosis. Characterization of individual gene expression changes for genes known to exhibit increased or decreased expression following heat stress, showed that males expressing the Stra8-Mgat4d-L-Myc transgene were comparatively resistant to heat stress and, at 43 °C, behaved similarly to non-transgenic germ cells treated at 33 °C, whereas non-transgenic males treated at 43C showed the marked gene expression changes predicted from the literature. To investigate gene expression differences in more depth, we performed microarray analyses on Mgat4d wild type and Mgat4d $\left[-/-\right]$ germ cells prepared only 8 hr after males were treated at 43 °C for 25 min, when no histological changes were apparent. Comparisons of DEGs and bioinformatics analyses using IPA, GSEA and EnrichR revealed that Mgat4d[-/-] heat-treated germ cells



Figure 8. Microarray analysis of germ cell cDNA. Two month C57BL/6J males were treated at 33 °C or 43 °C for 25 min and germ cells were harvested 8 hr after recovery. (**A**) Principal component analysis (PCA) for 33 °C-treated Mgat4d[+/+] (n=4) and Mgat4d[-/-] (n=3) arrays and 43 °C-treated Mgat4d[+/+] (n=3) and Mgat4d[-/-] (n=5) samples. (**B**) Volcano plots showing the distribution of DEGs based on their expressed log₂ fold-change and $-\log_{10} p$ value. Red dots represent genes with a log₂ fold-change lower than -0.6 or higher than 0.6 (equivalent to +/-1.5 fold-change) and a p value below the threshold of 0.05 ($-\log_{10} 10$ (0.05) = 1.3). (**C**) Correlation analysis of microarray chip data of wild type (WT) and Mgat4d[-/-] (KO) germ cells at 33 °C and 43 °C.



Figure 9. Validation and Ingenuity Pathway analysis (IPA). (**A**) qRT-PCR validation of up-regulated genes in control (n = 3) and Mgat4d[-/-] (n = 4) cDNA samples from the same mice used for microarray analyses. (**B**) qRT-PCR of down-regulated genes in the same samples. Relative expression was determined using *Actb* and *Rps2*. Assays were performed in triplicate. Error bars represent mean ± SEM; statistical analysis by two-tailed, unpaired Student's t-test *p < 0.05, **p < 0.01, ***p < 0.001. (**C**) Top canonical pathways in IPA significantly overrepresented in heat-treated Mgat4d[-/-] germ cells compared to wild type, normalized to their respective 33 °C counterparts, according to $-\log p$ value.

responded initially to heat stress, but did not sustain that response like wild type, heat-treated germ cells. Thus, Mgat4d[-/-] germ cells were less protected by autophagy or signaling pathways of inflammatory and proliferative responses. In addition, heat-treated Mgat4d[-/-] germ cells upregulated spermatogenic and spermiogenic genes to a greater extent than controls, indicative of the loss of a regulator of spermatogenesis - MGAT4D in this case. We previously showed that loss of MGAT1 in germ cells gave a similar upregulation of genes that promote spermatogenesis or spermiogenesis⁶.

A key question for the future is to determine how MGAT4D protects against heat shock in male germ cells. Interestingly, *Mgat4d* transcripts are markedly reduced by the 43 °C treatment and yet if MGAT4D is not present, germ cells are more sensitive to heat treatment, and if a *Mgat4d* transgene is present, germ cells are comparatively protected. Thus, the presence of MGAT4D, which may persist in wild type germ cells after *Mgat4d* transcripts are reduced by heat stress, appears to facilitate the sustained heat stress response observed in wild type germ cells. How this is accomplished by a type II transmembrane Golgi glycoprotein may be related to the effects of Golgi glycosyltransferases on Golgi fragmentation. Some Golgi glycosyltransferases of the medial and trans Golgi compartments have been shown to facilitate Golgi fragmentation after heat shock ^{35,36}. For example, the mucin O-glycan GlcNAcT CGNT3 promotes Golgi fragmentation following heat shock by interacting with myosin IIA via its cytoplasmic tail³⁶. MGAT4D is the most abundant protein in rat Golgi of male germ cells⁴ and its loss after heat shock may protect the Golgi from fragmentation and protect Golgi glycosyltransferases and other Golgi residents, including molecules that protect from inflammation and autophagy and that promote proliferation and survival, from degradation by the proteasome³⁶.

We previously published data on the expression of the *MGAT4D* gene in men with infertility problems³. The expression pattern followed closely the proportion of different germ cells present in the disease state. For example, men with Sertoli Cell Only syndrome have very low levels of *MGAT4D* expression. However, to date, we are not aware of any *MGAT4D* mutation that affects fertility in men. A recent in-depth review of genes affected in male fertility does not report any mutations in MGAT4D³⁷. In mice, we cannot rule out a subtle effect on fertility of knocking out the *Mgat4d* gene because fertility was not formally tested in our study. However, the frequency of litter production and litter sizes of *Mgat4d*[-/-] males over several years, did not indicate a reduction in fertility.

Materials and Methods

Mice. Mice carrying a conditional *Mgat4d* allele were generated from JM8A3.N1 ES cells carrying the targeting construct (Fig. 1) that were obtained from KOMP (project CSD79367). Targeted ES cells were injected into C57BL/6J blastocysts by the Gene Targeting Facility of the Albert Einstein College of Medicine. Chimeras were crossed to C57BL/6J mice and then to the FVB/NJ Stra8-iCre mice from Jackson Labs (Bar Harbor, Maine) Tg





(Stra8-icre)1Reb/J (Stock no. 008208 | Stra8-iCre) to generate *Mgat4d* deleted mice carrying LacZ/Neo (*Mgat4d*-LacZ/Neo) or to Flp1-Cre mice B6.129S4-*Gt*(*ROSA*)26Sor^{tm1(FLP1)Dym}/RainJ (Stock no. 009086 ROSA26:FLPe knock-in) to obtain mice carrying a conditional *Mgat4d* allele with *loxP* sites flanking exon 4 (*Mgat4d*[F/F]). The latter mice were crossed to mice carrying a Stra8-iCre transgene to generate conditional inactivation in spermatogonia to investigate spermatogenesis and fertility in males, or to generate mice with a whole body inactivation of *Mgat4d*. Transgenic mice used in this study were generated in Albert Einstein College of Medicine by the Transgenic Mouse Facility of the Albert Einstein College of Medicine on a C57BL/6J background. Two founders were characterized for each transgenic line. The constructs used are shown in Fig. 4. C57BL/6J and FVB/NJ mice were purchased from Jackson Laboratories (Stock No: 000664 and Stock No: 001800 respectively) and used for breeding. All mice carrying a transgene were kept as heterozygotes by crossing +/Tg with homozygote wild-type (+/+) mice. Mice were sacrificed by carbon dioxide asphyxiation followed by cervical dislocation. Testes were dissected free of surrounding tissue and weighed. The Institutional Animal Care and Use Committee (IACUC) of the Albert Einstein College of Medicine reviewed and approved the animal experiments reported herein under protocol nos. 20080813, 20110803, 20140803 and 20170709 to PS. The experiments reported herein were performed in accordance with the relevant guidelines and regulations of the Einstein IACUC.

Antibodies. Anti-MGAT4D C-terminus pAb (Genemed, Torrance, CA) was obtained from a MGAT4D C-terminus peptide conjugate CGTQSSFPGREQHLKDNYY injected into rabbits. Anti-MGAT4D N-terminus pAb (Covance, Denver, PA; Genemed, Torrance, CA) was obtained with a MGAT4D-L N-terminal peptide conjugate GESVGDLRTVATAPWEGEQARGV injected into rabbits. Both pAbs were affinity purified on respective peptide columns. Anti-Myc mouse mAb 9E10 was from Covance (Denver, PA). Biotinylated anti-rabbit second-ary antibody (cat. no. BA-1000) was from Vector Laboratories, Burlingame, CA.

Immunohistochemistry. Testes were fixed in Bouin's fixative (#100503–962, Electron Microscopic Sciences, Radnor, PA) for 48 hr at room temperature (RT) then processed and paraffin-embedded by the Einstein Histology and Comparative Pathology Facility. Serial sections (5-6 µm) were collected on positively-charged slides. Immunohistochemistry was performed following the "IHC staining protocol for paraffin-embedded sections" from Abcam (http://www.abcam.com/protocols/). Briefly, testis sections were deparaffinized using Histo-Clear reagent Cat no. HS-200 (National Diagnostics, Atlanta, GA). We performed a heat-induced epitope retrieval with citrate buffer (10 mM sodium citrate, 0.05% Tween 20, pH 6.0) at 100 °C for 20 min followed by 20 min period at room temperature in the same buffer. The tissue was permeabilized with 0.1% Triton X-100 in Tris-buffered saline (TBS) for 10 min and blocked for 1 hr at room temperature with 10% normal serum (from the same species as secondary antibody) and 1% BSA in TBS. The primary antibody was diluted in TBS with 1% BSA and incubated overnight at 4 °C (unless otherwise indicated). Endogenous peroxidase was quenched by incubating slides in 1.5% H₂O₂ in TBS for 10 min and rinsed before incubation with the biotinylated secondary antibody diluted in TBS containing 1% BSA, for 1 hr at room temperature. The samples were washed and Vectastain® ABC-HRP reagent (cat no. PK-6100, Vector laboratories, Inc.) was added and incubated at room temperature for 30 min. After rinsing, peroxidase substrate 3, 3'diaminobenzidine (DAB) (Vector laboratories, Cat# SK-4100) was used to detect the antibody, following the manufacturer protocol. The tissue was counter-stained with Mayer's Hematoxylin solution (cat no. MHS16-500 ML, Sigma-Aldrich). The specimens were dehydrated with histo-clear and mounted using Permount® reagent (cat no. SP15-100, Fisher Scientific, Fair Lawn, NJ). Testis section images were produced using 3DHistec Panoramic 250 Flash II slide scanner obtained with the Shared instrumentation Grant SIG# 1S10OD019961-01 to the Analytical Imaging Facility (AIF) of the Albert Einstein College of Medicine.

Western-blot analysis. Testis tissue lysates were prepared using RIPA Lysis Buffer (cat no. 20-188, Millipore, Temecula, CA) and following the protocol "Preparation of lysate from tissues" from Abcam with modifications. Briefly, the testis tissue was homogenized in 1X RIPA, 01% SDS, 1X protease inhibitor cocktail (cat no. 05892791001, Roche Diagnostics GmbH, Mannheim, Germany) at a ratio of 0.5 ml buffer for 0.05 g of tissue. The lysate was incubated with constant agitation (orbital shaker) at 4 °C for 2 hr and then centrifugated for 20 min at 12000 rpm at 4 °C. The supernatant was transferred to a fresh tube and supplemented with 100% glycerol to a final concentration of 20% glycerol. Protein yield was measured using Bradford based colorimetric assay, (cat no. 500–0006, Bio-Rad Protein assay, Bio-Rad, Hercules, CA). Isolated germ cells were lysed in buffer containing 1% IGEPAL, 1%TX-100, 0.5% Deoxycholate and 1X protease inhibitor cocktail in water. Briefly, 100 µl of lysis buffer was used to homogenize 10^7 cells. The lysate was incubated for 30 min on ice, then centrifugated 5 minutes at 5000 g. The supernatant was transferred to a fresh tube and supplemented with 100% glycerol to a final concentration of 20% glycerol. Protein using the Bradford-based colorimetric assay. All samples were stored at -80 °C.

Apoptosis assay. Apoptosis induced DNA damage was measured using the ApopTag[®] Peroxidase *In Situ* Apoptosis Detection Kit (S7100, EMD Millipore, Temecula, CA) following the manufacturer's protocol for paraffin-embedded tissue. Testis sections were deparaffinized using Histo-Clear reagent (HS-200, National Diagnostics, Atlanta, GA). Stained slides were scanned using a Perkin Elmer P250 high capacity slide scanner and images were analyzed using FIJI software to count foci³⁸.

Germ cells isolation. Male germ cells were purified from testis following a modified protocol^{39–41}. Mice were sacrificed by CO₂ asphysiation followed by cervical dislocation and both testes were collected in 2 ml DMEM: F12 medium (11330-032, Gibco, Grand Island, NY) on ice. The tunica albuginea was removed and tubules were transferred to 10 ml enzyme solution I (0.5 mg/ml collagenase Type I (C0130-1G, Sigma), 200 µg/ml DNase I (DN25-100 mg, Sigma) in F12 medium), briefly vortexed and incubated 30 min at 33 °C in a shaking water bath (100 oscillations/min). Every 10 min an additional manual shaking was done to help tissue dissociation. The dispersed seminiferous tubules were allowed to sediment and the supernatant was discarded. Tubules were washed with 10 ml fresh F12 medium and resuspended in fresh F12 medium. The mixture was layered on 40 ml of 5% Percoll (17-0891-02, GE Healthcare Bio-sciences AB, Uppsala, Sweden) in HBSS (55-022-PB, Mediatech, Inc. Manassas, VA) and allowed to settle for 20 min at room temperature. The top 45 ml containing Leydig cells was discarded and the remaining 5 ml were transferred to a new tube containing 10 ml of enzyme solution II (200 µg/ml DNase I, 1 mg/ml trypsin (T4799-5G, Sigma-Aldrich, St Louis, MO) in F12 medium). The mixture was incubated for 40 min at 33 °C in a shaking water bath (100 oscillations/min) and every 10 min, manual shaking. After tissue dissociation, 3 ml charcoal-stripped FBS were added and cells were resuspended using a 10 ml pipette to dissociate clumps. The suspension was filtered sequentially through a 70 µm (352350, Falcon Corning Incorporated, Corning, NY) then 40 µm (352340) nylon cell strainer and centrifugated at 500 g for 10 min at 4 °C. The cell pellet was resuspended in 1 ml PBS (calcium and magnesium free) and counted. Cells were stored as a dry pellet at -80 °C and used for protein or RNA extraction.

RNA isolation and RT-PCR. Testes or isolated germ cells were homogenized in TRIZOL reagent (15596018, Invitrogen) following the manufacturer's protocol for tissue or cell pellet, respectively. The isolated total RNA was dissolved in RNase-free water, an aliquot (2μ l) was used to measure nucleic acid concentration and the remainder was immediately stored at -80 °C. Total RNA (3μ g) was used to synthesize cDNA (75μ l final volume) with the Verso cDNA Synthesis Kit (AB-1453/A, Appliedbiosystems, Thermo scientific Baltics UAB, Vilnius, Lithuania) following the manufacturer's protocol. cDNA was tested for genomic DNA contamination using end-point PCR with *Actb* primers flanking an exon and intron sequence (Supplementary Table S6).

Quantitative PCR (qRT-PCR). cDNA obtained as described above was used to perform real time PCR. PowerUpTM SYBRTM Green Master Mix (A25742, Applied Biosystems, Thermo Scientific Baltics UAB, Vilnius, Lithuania) was mixed with each sample to a primer final concentration of 150 nm, following the manufacturer's protocol and run on a master cycler (ViiA 7, Thermo Fisher). PCR conditions were 95 °C for 30 sec, followed by 40 cycles at 95 °C for 15 sec, 60 °C for 15 sec and 72 °C for 20 sec. Unless otherwise stated, gene expression relative to *Actb* and *Rps2* was calculated by the log2^{ddCT} method⁴².

Histological analysis. Hematoxylin and eosin (H&E) counter stained testis sections were analyzed by light microscopy (Zeiss Axiovert 200M, Göttingen, GERMANY) or scanned using a Perkin Elmer P250 high capacity slide scanner and processed using the proprietary software CaseViewer (3D Histech P250 high capacity slide scanner, Perkin Elmer, Waltham, MA).

Mild heat stress treatment. This protocol was adapted from^{12,43,44}. Briefly, an adult male mouse was anaesthetized in an isoflurane chamber with a constant oxygen flow of 2 L/min and 3% isoflurane for 1 min followed by 2.5% isoflurane for 3 min. The mouse was quickly removed from the chamber and its nose was introduced into a nose cone with the same anaesthesia parameters for another 1 min. Testes were secured in the scrotum by manual massage and one third of the body (hind legs, tail and scrotum) was immersed in a 43 °C or 33 °C (control) water bath, supported by a plastic tube for 25 min. During the experiment, the isoflurane flow was reduced every 10 min by 0.5% to reach 1.5% at the end of the treatment (2.5% for 5 min after introduction into the water bath, then 2% for 10 min and followed by 1.5% for another 10 min). After the heat treatment, mice were dried on paper towel, allowed to recover in a chamber with oxygen flow at 2 L/min and 0% isoflurane for 5 to 10 min, then returned to a cage to recover from the effects of anaesthesia on a heating pad. Testes and epididymis were harvested 8 hr or 24 hr after treatment.

Microarray. Germ cell RNA (150 ng, RIN >7.9) was provided to the Genomics Core Facility of the Albert

Einstein College of Medicine for conversion to cDNA, labeling and hybridization to a mouse Affymetrix ClariomTM D array previously known as GeneChipTM Mouse Transcriptome Array 1.0 (Affymetrix, Santa Clara, CA). Raw intensity data (.CEL files) were mapped to genes using custom CDF files (clariomdmousemmgenco-degcdf from http://brainarray.mbni.med.umich.edu/Brainarray/Database/CustomCDF/genomic_curated_CDF. asp), and rma-normalized using the R/Bioconductor package affy⁴⁵. Differential gene expression was modeled using limma⁴⁶. Genes with Benjamini-Hochberg-adjusted p-values < 0.05 and fold-change >1.5 or <-1.5 were defined as differentially expressed genes (DEGs).

Gene set enrichment analysis and ingenuity pathway analysis. Gene set enrichment analysis (GSEA)^{27,28} was performed to determine enrichment of gene sets from the curated (C2), GO (C5), and oncogenic signatures (C6) and Hallmark collections. Gene list enrichment analysis was performed using EnrichR³⁰ and Ingenuity Pathway Analysis IPA (www.qiagen.com/ingenuity, QIAGEN, Redwood City, CA) for genes with fold-change \pm 1.5, p < 0.05 and False discovery rate p < 0.05.

Statistical analysis. The bar graphs in all figures represent the mean \pm SEM. Unpaired, two-tailed Student's t test or one way ANOVA was used to calculate *p*-value using Graph Pad Prism 7.0 (Graph Pad Software Inc., La Jolla, CA). Statistical significance was indicated by *p < 0.05, **p < 0.01, ***p < 0.001 or ****p < 0.0001.

Data availability

The data generated and/or analysed for the current study are available from the corresponding author on reasonable request. Microarray data are deposited in NCBI's Gene Expression Omnibus (GEO) and are accessible through GEO serial accession number GSE137307.

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Author contributions

A.A. performed all experiments on transgenic mice, all microarray and validation experiments, data curation, bioinformatics analyses, and co-wrote the manuscript; M.L. characterized the original cohort of *Mgat4d* control and K.O. mice and transgenic mice, performed heat shock experiments and analyses on the old cohort and edited the paper; B.B. performed bioinformatics analyses and interpretation and edited the paper; F.B. developed the *Mgat4d* conditional and global knockout mice, and the LacZ mice; J.A. performed and interpreted MALDI-IMS data; J.P. made transgenic constructs, and bred mutant and transgenic mice; A.S. performed confocal microscopy; S.S. characterized antibodies; P.S. conceived and directed experiments, curated and interpreted data and co-wrote the paper.

Competing interests

The authors declare no competing interests.

Additional information

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