Insulin-regulated serine and lipid metabolism drive peripheral neuropathy

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Diabetes represents a spectrum of disease in which metabolic dysfunction damages multiple organ systems including liver, kidneys and peripheral nerves^{1,2}. Although the onset and progression of these co-morbidities are linked with insulin resistance, hyperglycaemia and dyslipidaemia³⁻⁷, aberrant non-essential amino acid (NEAA) metabolism also contributes to the pathogenesis of diabetes⁸⁻¹⁰. Serine and glycine are closely related NEAAs whose levels are consistently reduced in patients with metabolic syndrome¹⁰⁻¹⁴, but the mechanistic drivers and downstream consequences of this metabotype remain unclear. Low systemic serine and glycine are also emerging as a hallmark of macular and peripheral nerve disorders, correlating with impaired visual acuity and peripheral neuropathy^{15,16}. Here we demonstrate that aberrant serine homeostasis drives serine and glycine deficiencies in diabetic mice, which can be diagnosed with a serine tolerance test that quantifies serine uptake and disposal. Mimicking these metabolic alterations in young mice by dietary serine or glycine restriction together with high fat intake markedly accelerates the onset of small fibre neuropathy while reducing adiposity. Normalization of serine by dietary supplementation and mitigation of dyslipidaemia with myriocin both alleviate neuropathy in diabetic mice, linking serine-associated peripheral neuropathy to sphingolipid metabolism. These findings identify systemic serine deficiency and dyslipidaemia as novel risk factors for peripheral neuropathy that may be exploited therapeutically.

To explore how obesity and diabetes influence serine, glycine and one-carbon(SGOC)metabolism, we quantified serine, glycine and methionine across tissues in an established mouse model of morbid obesity, insulin resistance and hyperglycaemia (leptin receptor-deficient *db/db* mice on a black Kaliss background (BKS-*db/db*)) and compared results with age-matched wild-type C57BL/6J controls. The *db/db* mice showed reductions of around 30% in hepatic and renal serine levels relative to wild-type mice (Fig. 1a and Extended Data Fig. 1a), and the more abundant glycine pools were reduced by 30–50% in liver, kidney, inguinal white adipose tissue (iWAT) and plasma (Fig. 1a and Extended Data Fig. 1a–c). Methionine is linked to serine through one-carbon metabolism and was also reduced in liver, iWAT, and plasma (Fig. 1a and Extended Data Fig. 1b,c), suggesting that diabetes decreases serine and glycine levels in tissues that are important for glucose and lipid homeostasis.

Mammals obtain serine from the diet, de novo synthesis from glucose and via glycine and one-carbon metabolism, with the liver and kidney serving as major sites for postprandial NEAA metabolism (Fig. 1b). To better understand the mechanistic basis of reduced hepatic serine and glycine in db/db mice, we quantified the expression of genes associated with SGOC metabolism after a 6-h fast (Fig. 1c). Genes encoding key enzymes responsible for serine and one-carbon unit catabolism or disposal were significantly upregulated in *db/db* mice, including serine dehydratase (Sds), serine hydroxymethyltransferase 1 (Shmt1), Shmt2 and 10-formyltetrahydrofolate dehydrogenase (Aldh1l1). The expression of two genes encoding components of the glycine cleavage system-glycine decarboxylase (Gldc) and dihydrolipoamide dehydrogenase (Dld)-was increased in db/db liver, whereas the expression of 3-phosphoglycerate dehydrogenase (Phgdh) and methylenetetrahydrofolate dehydrogenase 2 (Mthfd2) were both significantly reduced, indicating that de novo serine synthesis may also be limited in diabetic mice. These results are consistent with genome-scale metabolic modelling of transcription data from human diabetic liver¹⁷. The kidney is another centre for SGOC metabolism¹⁸ and renal expression of Shmt1

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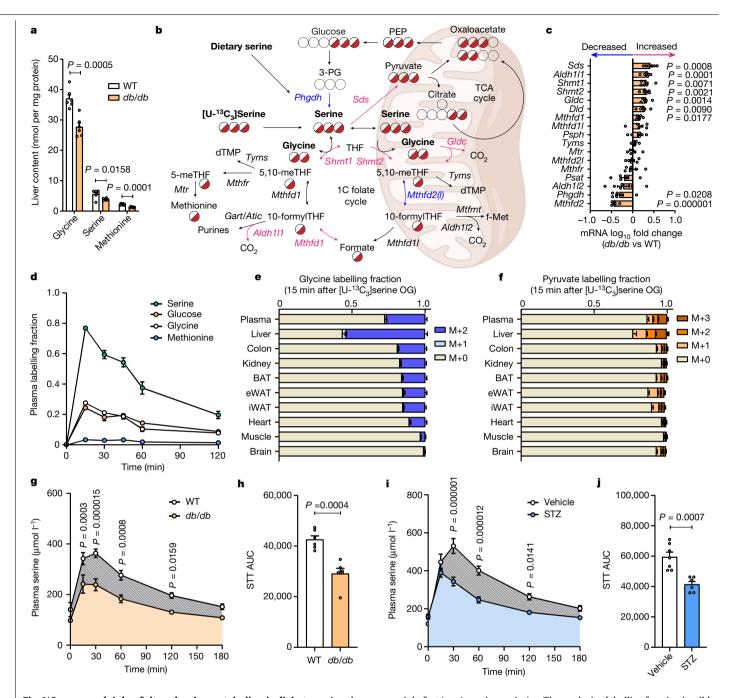


Fig. 1 | **Sources and sinks of altered serine metabolism in diabetes. a**, Levels of glycine, serine and methionine in the liver of wild-type and BKS-*db/db* mice after a 6-h fast (n = 6 per group). **b**, Schematic of serine and glycine biosynthetic and catabolic pathways. Upregulated hepatic genes in BKS-*db/db* mice are in purple, and downregulated are genes are in blue. 10-formylTHF, 10-formyltetrahydrofolate; 3-PG, 3-phosphoglycerate; 5,10-meTHF, 5,10-methylenetetrahydrofolate; dTMP, deoxythymidine monophosphate; f-Met, *N*-formylmethionine; PEP, phosphoenol pyruvate; TCA, tricarboxylic acid; THF, tetrahydrofolate. **c**, mRNA expression of liver enzyme genes regulating SGOC metabolism in wild-type and BKS-*db/db* mice (n = 6 per group). **d**, Plasma serine, glucose, glycine and methionine-labelling fraction $(1 - M_0)$ in wild-type mice administered [U-¹³C₃]serine via oral gavage after an

and several genes encoding enzymes associated with one-carbon metabolism were increased in db/db mice (Extended Data Fig. 1d).

Circadian and postprandial variations in amino acids and glucose make the diagnosis of metabolic defects challenging. We therefore

overnight fast (n = 4 per time point). **e**, Tissue glycine labelling fraction in wildtype mice 15 min after [U-¹³C₃]serine administration via oral gavage (n = 4 per tissue) following an overnight fast. **f**, Tissue pyruvate labelling fraction in wildtype mice 15 min after [U-¹³C₃]serine administration via oral gavage (n = 4 per tissue) after an overnight fast. **g**, Combined OGTT and STT in wild-type and BKS-*db/db* mice (n = 6 per group) after an overnight fast. **h**, STT AUC in wild-type and BKS-*db/db* mice (n = 6 per group). **i**, Combined OGTT and STT in vehicle-(n = 7) and STZ-treated (n = 6) C57BL/6J mice after an overnight fast. **j**, STT AUC in vehicle- (n = 7) and STZ-treated (n = 6) C57BL/6J mice. Data are mean ± s.e.m., and were analysed using two-sided independent *t*-test (**a**, **c**, **h**, **j**) and two-way ANOVA with Fisher's least significant difference post hoc test (**g**, **i**). The schematic in Fig. 1b was prepared in BioRender.

hypothesized that a 'serine tolerance test' (STT) could better assess SGOC metabolism in mice and identify those with elevated serine disposal. Applying similar dosages to those used in human clinical trials (ClinicalTrials.gov: NCT03062449) (400 mg kg⁻¹), we orally

administered serine to overnight-fasted wild-type mice and quantified plasma serine pharmacokinetics to gauge the dynamics of serine clearance, with levels returning to baseline in approximately 2 h (Extended Data Fig. 1e). To identify the principal pathways involved in serine disposal, we orally administered [U-¹³C₃]serine to overnight-fasted wild-type mice and quantified the enrichment of downstream metabolites. We observed that glucose was labelled to a similar extent as glycine throughout the test (Fig. 1d), and [U-¹³C₃]serine-derived carbon was significantly incorporated into hepatic glycine, pyruvate and citrate pools (Fig. 1e, f and Extended Data Fig. 1f, g), demonstrating that hepatic gluconeogenesis is a major pathway for serine disposal in some contexts and linking its regulation to insulin and glucagon, which are both elevated in *db/db* mice (Extended Data Fig. 2a-c). To test whether insulin resistance affects serine absorption and disposal, we delivered both glucose (2 g kg⁻¹) and serine (400 mg kg⁻¹) to overnight-fasted wild-type and db/db mice. We observed a significant reduction in STT area under the curve (AUC) in *db/db* mice (Fig. 1g,h and Extended Data Fig. 2d), despite the higher dose administered. Notably, acute serine challenge had essentially no effect on circulating glycine concentrations (Extended Data Fig. 2e), despite evidence of their rapid interconversion (Fig. 1d,e). Conversely, there were no differences in STT AUC between wild-type and db/db mice when serine was administered without glucose (Extended Data Fig. 2f).

To determine whether elevated serine disposal is specific to leptin receptor-deficient *db/db* mice or is more generally attributable to impaired insulin signalling, we treated C57BL/6J mice with vehicle or streptozotocin (STZ) to induce insulin deficiency, hyperglycaemia and fat loss (Extended Data Fig. 2g–i). Plasma glycine and branched-chain amino acids (but not serine) were altered one week after STZ treatment (Extended Data Fig. 2j). Two weeks after injection, co-administration of glucose and serine revealed elevated serine disposal in STZ-diabetic mice relative to controls (Fig. 1i, j and Extended Data Fig. 2k), suggesting that insulin resistance or deficiency can both contribute to reduced circulating serine in diabetic mice.

Clinical studies have implicated serine deficiency in the regulation of macular disease and peripheral neuropathy^{15,16}. Given the impaired serine homeostasis in *db/db* mice, we next confirmed that aberrant serine metabolism is coincident with peripheral neuropathy in this model. Fourteen-week-old *db/db* mice exhibited thermal and tactile hypoalgesia as well as decreased motor nerve conduction velocity (MNCV) (Extended Data Fig. 2l–n). These findings suggest that aberrant serine homeostasis is associated with diabetic peripheral neuropathy.

Serine remodels lipid metabolism

Serine and glycine restriction is widely used to modulate health outcomes in mice and is relatively well-tolerated for several months^{16,19-22}. To model the effect of systemic serine deficiency in the context of diet-induced obesity, we fed mice low-fat (10% kcal) (LFD) or high-fat (60% kcal from fat) (HFD) diets and compared their phenotypes to mice fed isonitrogenous diets lacking serine and glycine (-SG LFD or -SG HFD) (Supplementary Table 1). Both -SG diets effectively reduced circulating and hepatic serine and glycine contents during the fed state but not during the fasted state (Fig. 2a,b and Extended Data Fig. 3a,b). The HFD alone reduced liver glycine levels, but to a lesser extent than dietary serine and glycine withdrawal (Extended Data Fig. 3b). Other serine and glycine-derived hepatic metabolites, including glutathione, were not strongly affected by their restriction (Extended Data Fig. 3b). Of note, weight gain caused by HFD was attenuated by dietary serine and glycine restriction, whereas food, calorie and water intake, calorie absorption, and physical activity were all unaffected (Fig. 2c and Extended Data Fig. 3c-h). Using echo magnetic resonance imaging (echoMRI), we quantified lean and fat masses across all groups and observed that dietary serine restriction significantly reduced fat mass but had no effect on lean mass relative to the HFD

To determine how feeding with –SG HFD influences glucose homeostasis, we analysed mice using standard GTTs and ITTs. Whereas –SG HFD attenuated obesity, the mice remained glucose and insulin intolerant (Fig. 2e,f and Extended Data Fig. 3j,k), suggesting that serine and glycine restriction and the consequent reduction in adiposity do not prevent HFD-induced glucose intolerance and insulin resistance. To test whether altered systemic substrate utilization of carbohydrates in preference to lipids were driving the changes in adiposity, we placed mice that had consumed each diet for 18 weeks in metabolic cages and quantified the respiratory exchange ratio (RER). Whereas the HFD altered RER as expected, no changes were observed with dietary serine/ glycine restriction (Extended Data Fig. 3l).

Next, we performed a metagenomic analysis of faecal microbiota to understand how the above diets affected microbiome composition and diversity, which correlate with and can buffer against dietary deficiencies²³. Sustained HFD or -SG HFD feeding reduced phylogenetic alpha diversity relative to LFD-fed mice, whereas -SG LFD feeding increased alpha diversity (Fig. 2g). Conversely, PERMANOVA testing of Aitchison distances from robust principal component analysis revealed significant beta-diversity differences between -SG HFD-fed mice and other groups, highlighting the distinct effect of this low-carbohydrate, high-fat, serine and glycine-restricted diet on the faecal microbiome (Extended Data Fig. 4a). Furthermore, the log ratios of strains of microorganisms expressing complete serine biosynthesis and glycine cleavage pathways were increased and decreased, respectively, by -SG HFD (Extended Data Fig. 4b,c), and this diet reduced the log ratio of strains expressing a complete fatty acid synthesis pathway (Fig. 2h). Key strains showing the strongest alterations are listed in Extended Data Fig. 4d. Notably, -SG LFD feeding did not modulate strains in this manner, presumably owing to the higher carbohydrate content, which could facilitate serine synthesis.

Next, to directly investigate how serine deficiency affects hepatic lipogenesis, mice fed the above diets for 18 weeks were administered heavy water (D₂O) for 18 h, and lipids were extracted for quantification of isotope enrichment, molar abundance, and synthesis²⁴. Dietary serine and glycine restriction potently reduced hepatic palmitate synthesis by around 70% relative to serine-replete control diets (Fig. 2i and Extended Data Fig. 5a). Hepatic cholesterol synthesis was increased in -SG HFD compared with HFD (Extended Data Fig. 5b). Consistent with these changes, hepatic expression of ATP-citrate lyase (ACLY), acetyl-CoA carboxylase (ACC2) and stearoyl-CoA desaturase (SCD1) were strongly reduced (around 50%) by dietary serine restriction, whereas the expression of cholesterol biosynthesis enzymes was unchanged or increased (Extended Data Fig. 5c-e). Changes in AKT phosphorylation at Ser473 and Thr308 correlated with dietary fat and carbohydrate content rather than serine and glycine levels, further suggesting that serine restriction drives changes in fatty acid metabolism that are independent from insulin signalling (Extended Data Fig. 5c).

Serine restriction and HFD accelerate neuropathy

Systemic serine deficiency has recently been linked to various neurodegenerative disorders^{16,25-28}. People with diabetes who have elevated serine disposal could therefore be more susceptible to neurological co-morbidities reminiscent of serine-associated peripheral neuropathy. To determine whether long-term, chronic serine deficiency is sufficient to drive peripheral neuropathy, we fed mice either control or serine- and glycine-free chow diets (19.2% of energy from fat) for up to 12 months. Temporal quantification of the thermal response to heat revealed progression to hypoalgesia after 12 months of dietary intervention (Extended Data Fig. 6a), consistent with previous observations¹⁶. At this time point we also detected reduced intraepidermal

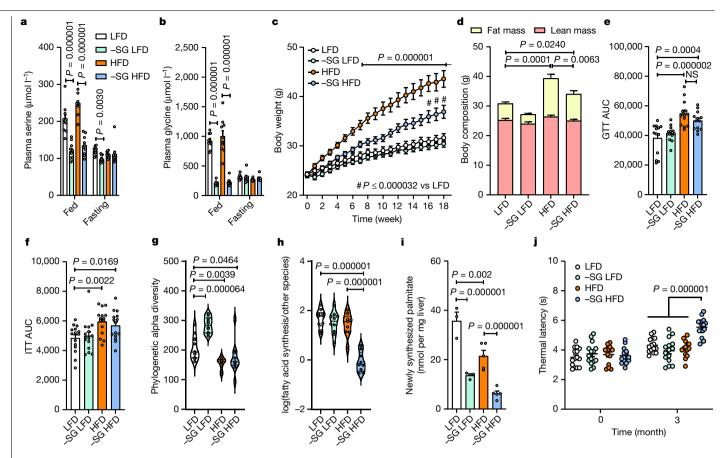


Fig. 2 | **Dietary serine restriction suppresses fatty acid synthesis and mitigates adiposity. a**, Plasma serine levels in fed and overnight-fasted mice fed with LFD, -SG LFD, HFD or -SG HFD for 18 weeks (*n* = 10 per group). **b**, Plasma glycine levels in mice fed with LFD, -SG LFD, HFD or -SG HFD for 18 weeks (*n* = 10 per group). **c**, Body weight of mice fed with LFD, -SG LFD, HFD, or -SG HFD (*n* = 13 per group). **d**, Body composition in mice 18 weeks after feeding with LFD (*n* = 10), -SG LFD (*n* = 12), HFD (*n* = 13) or -SG HFD (*n* = 13). **e**, Glucose tolerance test (GTT) AUC 18 weeks after feeding with LFD, -SG LFD, HFD or -SG HFD (*n* = 13 per group). **f**, Insulin tolerance test (ITT) AUC 18 weeks after feeding with LFD, -SG LFD, HFD or -SG HFD (*n* = 15 per group). **g**, Phylogenetic alpha

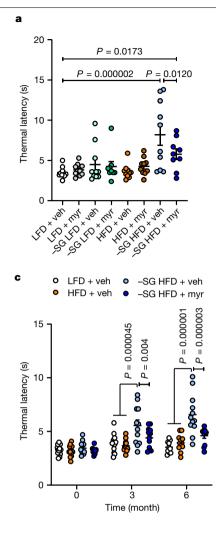
nerve fibre (IENF) density in paw skin (Extended Data Fig. 6b), which is also a clinical measure of small sensory fibre degeneration²⁹. Of note, mice fed –SG HFD for just three months exhibited marked thermal hypoalgesia (Fig. 2j), indicating that a combination of low systemic serine and HFD accelerate the onset of peripheral neuropathy in mice.

Serine is essential for the biosynthesis of canonical sphingolipids, which are enriched in the nervous system. When serine becomes limited, serine palmitoyltransferase (SPT) incorporates other amino acids, including alanine, to form non-canonical deoxysphingolipids^{30,31}. Given the importance of canonical ceramides and 1-deoxy(dihydro) ceramides in obesity and neuropathy, respectively^{15,32}, we hypothesized that SPT inhibition could influence the observed obesity and neuropathy phenotypes. We therefore administered myriocin (0.3 mg kg⁻¹ every other day), an inhibitor of SPT, or vehicle to mice fed the above diets for 6 months and quantified sphingolipid diversity and thermal sensing. Consistent with previous reports³², myriocin treatment attenuated HFD-induced weight gain without affecting plasma serine and glycine levels (Extended Data Fig. 6c-f) However, myriocin also mitigated thermal hypoalgesia exhibited by mice fed -SG HFD (Fig. 3a), suggesting that a reduction in SPT activity reduced serine-associated peripheral neuropathy.

To better understand the metabolic drivers of this peripheral neuropathy phenotype, we next quantified ceramides and

diversity in mice fed with LFD, -SG LFD, HFD or -SG HFD (n = 10 per group). **h**, Log fraction of species from the fatty acid synthesis pathway in mice fed with LFD (n = 10), -SG LFD (n = 10), HFD (n = 9) or -SG HFD (n = 9) for 18 weeks. **i**, Hepatic de novo palmitate synthesis in mice fed with LFD (n = 3), -SG LFD(n = 4), HFD (n = 5) or -SG HFD (n = 5) for 18 weeks. **j**, Thermal sensing in mice fed with LFD (n = 15), -SG LFD (n = 15), HFD (n = 14) or -SG HFD (n = 15 per group). Data are mean \pm s.e.m. and minimum and maximum (**g**,**h**), and were analysed using two-way ANOVA with Fisher's least significant difference post hoc test (**a**-**j**).

deoxydihydroceramides (deoxyDHCer) in liver and sciatic nerve. Restriction of serine and glycine increased deoxyDHCer in LFD and HFD settings and reduced canonical ceramides in HFD background, whereas myriocin generally reduced abundances of sphingolipids (Fig. 3b and Extended Data Fig. 6g-i). By contrast, ceramide and 1-deoxysphingolipid levels were unaltered or did not correlate with peripheral neuropathy phenotype in sciatic nerve, potentially owing to the large lipid deposits present in myelin (Extended Data Fig. 6h,i). Notably, serine restriction in a LFD background did not induce thermal hypoalgesia after six months (Fig. 3a), indicating that 1-deoxysphingolipid accumulation alone is insufficient to drive this phenotype and consistent with recent reports of an Sptlc1^{CL33W} mouse model³³. Next, we measured IENF density, corneal nerve density, and tissue lipids in a separate cohort of mice fed LFD, HFD, -SG HFD or -SG HFD plus myriocin for six months. Myriocin mitigated the onset of thermal hypoalgesia in mice fed -SG HFD (Fig. 3c), and this treatment also protected small fibre nerve density in the epidermis and cornea (Fig. 3d and Extended Data Fig. 7a,b) without affecting tactile sensing or MNCV (Extended Data Fig. 7c,d), suggesting this early-onset phenotype is specific to small sensory fibres and 1-deoxysphingolipids, in contrast to other nodes in sphingolipid metabolism³⁴. Mice fed -SG HFD exhibited increased hepatic 1-deoxysphingolipids and sphingomyelin, whereas myriocin strongly reduced the levels of sphingolipids as well



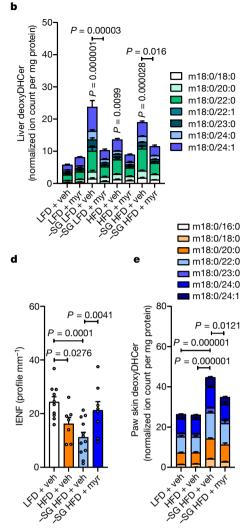


Fig. 3 | **Inhibition of de novo sphingolipid biosynthesis decelerates the kinetics of serine-associated peripheral neuropathy. a**, Thermal latency in mice fed with LFD plus vehicle (veh) (n = 10), LFD plus 0.3 mg kg⁻¹myriocin (myr) (n = 10), -SG LFD plus vehicle (n = 10), -SG LFD plus myriocin (n = 9), HFD plus vehicle (n = 10), HFD plus myriocin (n = 10), -SG HFD plus vehicle (n = 10) or -SG HFD plus myriocin (n = 9). **b**, Stack plot of liver deoxyDHCer in mice fed with LFD plus vehicle (n = 10), LFD plus myriocin (n = 10), -SG LFD plus vehicle (n = 10), -SG LFD plus myriocin (n = 9), HFD plus vehicle (n = 10), HFD plus myriocin (n = 10), -SG HFD plus vehicle (n = 10), HFD plus myriocin (n = 10), -SG HFD plus vehicle (n = 10), HFD plus myriocin (n = 10), -SG HFD plus vehicle (n = 10), HFD plus myriocin (n = 9). **c**, Thermal latency time course in mice fed with LFD plus vehicle (n = 12), HFD

as triglycerides and diacylglycerides (Extended Data Fig. 7e), further highlighting the pleiotropic effects of this molecule on the lipidome^{32,35}. Finally, paw skin exhibited a significant increase in deoxyDHCer that was reduced with myriocin treatment (Fig. 3e), suggesting the lipid microenvironment surrounding small fibres can influence sensory function.

We next evaluated whether suppressing SPT activity could mitigate neuropathy in db/db mice, which have increased circulating deoxySA as well as increased hepatic ceramides and deoxyDHCer (Extended Data Fig. 8a,b). Consistent with results in the –SG HFD diet-induced peripheral neuropathy model, administration of myriocin at six weeks of age prevented progression to thermal hypoalgesia and restored tactile sensation in db/db mice (Extended Data Fig. 8c,d). IENF density was also increased in db/db mice dosed for eight weeks with myriocin (Extended Data Fig. 8e). Although myriocin did not affect body weight gain, hyperglycaemia or plasma serine levels (Extended Data

plus vehicle (n = 12), -SG HFD plus vehicle (n = 12) or -SG HFD plus myriocin (n = 11). **d**, IENF density in mice fed with LFD plus vehicle (n = 10), HFD plus vehicle (n = 7), -SG HFD plus vehicle (n = 12) or -SG HFD plus myriocin (n = 8). **e**, Paw skin deoxyDHCer distribution in mice fed with LFD plus vehicle (n = 12), HFD plus vehicle (n = 12), -SG HFD plus vehicle (n = 12) or -SG HFD plus myriocin (n = 11). Data are mean ± s.e.m., and were analysed using one-way ANOVA with Fisher's least significant difference post hoc test (**a**, **b**, **d**, **e**) or two-way ANOVA with Fisher's least significant difference post hoc test (**c**). Statistical analyses in **b**, **e** were performed using summed deoxyDHCer abundances.

Fig. 8f–h), it strongly reduced canonical sphingolipids in the liver but showed limited effects on paw skin 1-deoxysphingolipids and ceramides (Extended Data Fig. 8i–n). Thus, myriocin probably acts through both direct and indirect mechanisms targeting liver and other tissues, which also accounts for its toxicity³⁵.

Serine supplementation slows neuropathy

Considering the chronic serine deficiency exhibited by diabetic mice, we next fed *db/db* mice a 3% serine-enriched diet starting at 6 weeks of age and quantified neuropathy phenotypes. Thermal sensation was measured at 6, 10 and 14 weeks of age and tactile sensation at time of sacrifice, at which point mice exhibited elevated plasma and hepatic serine, but not glycine, levels (Fig. 4a,b). We observed no change in body weight and a slight increase in circulating glucose levels in this cohort (Extended Data Fig. 9a,b). However, both thermal and

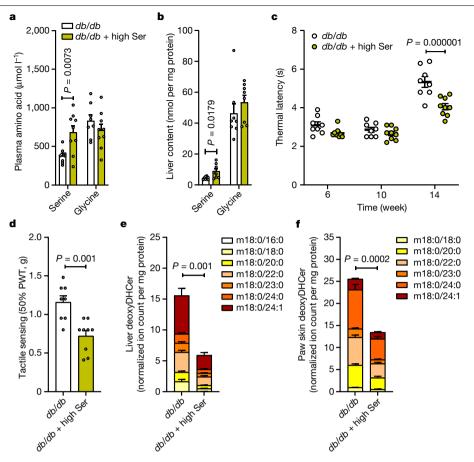


Fig. 4 | **Dietary serine supplementation reduces deoxysphingolipid content and slows down peripheral neuropathy. a**, Plasma amino acid levels in the fed state in BKS-*db/db* mice fed with either a control (*n* = 8) or serinesupplemented diet (*n* = 9) for 8 weeks. **b**, Liver amino acid content in the fed state in BKS-*db/db* mice fed with either a control or serine-supplemented diet for 8 weeks (*n* = 8 per group). **c**, Thermal latency time course in BKS-*db/db* mice fed with either a control (*n* = 8) or serine-supplemented diet (*n* = 9). **d**, Tactile sensing 8 weeks after feeding BKS-*db/db* mice with either a control (*n* = 8) or

tactile hypoalgesia were reduced in mice fed this serine-enriched diet (Fig. 4c,d). Of note, no change in canonical sphingolipids was observed across tissues, yet 1-deoxysphingolipids were robustly decreased in both liver and paw skin (Fig. 4e,f and Extended Data Fig. 9c-f). Collectively, these data suggest that supplementation of serine can slow the progression of diabetic peripheral neuropathy.

Discussion

Here we describe how direct or indirect induction of chronic, systemic serine deficiency alters lipid homeostasis and contributes to diabetic peripheral neuropathy. Modulating dyslipidaemia with myriocin or 1-deoxysphingolipid biosynthesis with serine supplementation both mitigate thermal and tactile hypoalgesia in obese diabetic mice. These results highlight how serine deficiency can synergize with dyslipidaemia to alter neurological phenotypes both in rare disease contexts^{16,25,26} and indirectly via a widespread, chronic disease such as type 2 diabetes, where it manifests as a co-morbidity experienced by a subset of patients. Reduced circulating serine and glycine in diabetic mice may be driven by increased flux through gluconeogenesis, one-carbon metabolism, renal retention^{18,36} and/or disposal as acylglycines³⁷, which are also influenced by dyslipidaemia³⁸.

A STT, analogous to an oral glucose tolerance test (OGTT), could identify patients that exhibit elevated, postprandial serine disposal and who

serine-supplemented diet (n = 9). **e**, Levels of deoxyDHCer in the liver in BKS-db/db mice fed with either a control or serine-supplemented diet for 8 weeks (n = 8 per group). **f**, Levels of deoxyDHCer in the paw skin of BKS-db/dbmice fed with either a control or serine-supplemented diet for 8 weeks (n = 8per group). Data are mean \pm s.e.m., and were analysed using a two-sided independent *t*-test (**a**,**b**,**d**-**f**) or two-way ANOVA with Fisher's least significant difference post hoc test (**c**). Statistical analyses in **e**,**f** were performed using summed deoxyDHCer abundances.

might be particularly susceptible to sensory neuropathy. Normalizing circulating serine levels via dietary supplementation delays the onset and progression of sensory neuropathy in *db/db* mice. Indeed, supplementation of serine and B vitamins improves peripheral neuropathy in some pre-clinical models and are the focus of clinical trials for various neurodegenerative disorders^{39–41} (ClinicalTrials.gov: NCT03062449). Our results highlight physiologically relevant molecular links between serine and glycine homeostasis, sphingolipid metabolism, and diabetic co-morbidities. The metabolic and neuropathic phenotypes of mouse models of diabetes and obesity vary across strains and genotypes^{42,43}, and C57BL6/J mice are particularly sensitive to the metabolic consequences of HFD owing to mutations in *Nnt*⁴⁴ and other genes. However, our data in both diabetic *db/db* mice and in C57BL6/J mice fed –SG HFD demonstrate that serine deficiency combined with dyslipidaemia can drive peripheral neuropathy in different genetic backgrounds.

Several key questions remain, including why serine and glycine deprivation suppresses hepatic fatty acid synthesis and gene expression in the liver. In addition, diverse sphingolipid species and/or their mis-localization contribute to neuropathy^{21,45-48}, but their exact mechanisms of toxicity remain unclear. We have developed and validated a dietary model of serine-associated sensory neuropathy that develops a phenotype in three months, which could aid in understanding how neurotoxic dyslipidaemia can be managed. Diverse genetic changes may influence circulating serine and glycine, including common

single nucleotide polymorphisms and rare coding events^{25,28,49}, or such deficiencies could be induced by diabetes-induced rewired hepatic metabolism. Thus, in both altering sphingolipid diversity and compromising the liver's ability to handle nutritional lipid overload, systemic serine deficiency emerges as a modifier of age- and diabetes-associated neuropathies.

Online content

Any methods, additional references, Nature Portfolio reporting summaries, source data, extended data, supplementary information, acknowledgements, peer review information; details of author contributions and competing interests; and statements of data and code availability are available at https://doi.org/10.1038/s41586-022-05637-6.

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Methods

Mouse experiments

All mouse experiments were approved and conducted in accordance with the Institutional Animal Care and Use Committee (IACUC) of the University of California, San Diego and the Salk Institute for Biological Studies. Mice were housed in the same room ensuring exposure to the same temperature (21 °C), humidity (ambient humidity 65%) and a 12-h light:dark cycle (06:00-18:00). In Fig. 1, 14- to 16-week-old C57BL/6J (JAX 000664) or BKS-db/db mice (JAX 000642), and 10- to 12-week-old vehicle- or STZ-treated C57BL/6J (JAX 000664) mice were fasted for 6 h prior to tissue collection. Animals were anaesthetized with isoflurane, decapitated, and tissues were rapidly collected using Wollenberger clamps pre-cooled to the temperature of liquid nitrogen and stored at -80 °C until analysis. For Fig. 2, 8-week-old C57BL/6J (JAX 000664) were fed with diets obtained from Envigo. Dietary composition is detailed in Supplementary Table 1. In dietary experiments, tissues were collected between 07:00-10:00 h-that is, in the fed state unless stated otherwise. From a separate cohort of animals, plasma samples were collected 18 weeks after dietary intervention in the fed (07:00-10:00 h) and fasted (18-h overnight fast) state. In db/db mice experiments, tissues were collected after 6-h fasting. For Fig. 3, 8-week-old C57BL/6J (JAX 000664) were fed with diets obtained from Envigo. Tissue collection took place between 07:00-10:00 h. Animals were anaesthetized with isoflurane, decapitated, and tissues were rapidly collected using Wollenberger clamps pre-cooled to the temperature of liquid nitrogen and stored at -80 °C until analysis. For Fig. 4, 6-week-old BKS-db/db mice (JAX 000642) were fed with either a control or serine-supplemented diet (provided by Envigo) for a period of 8 weeks. Tissue collection took place between 07:00-10:00 h unless stated otherwise. Animals were anaesthetized with isoflurane, decapitated, and tissues rapidly collected using Wollenberger clamps pre-cooled to the temperature of liquid nitrogen and stored at -80 °C until analysis.

Serine tolerance test

Age-matched 14- to 16-week-old wild-type and BKS-*db/db*, and 10- to 12-week-old vehicle- and STZ-treated C57BL/6J (JAX 000664) mice were fasted overnight with water access provided ad libitum. For a STT, animals were weighed, and serine and/or glucose were administered via oral gavage at a dose of 400 mg kg⁻¹ and 2 g kg⁻¹, respectively, with tail tip blood samples collected into EDTA-coated microvette tubes (Sarstedt) before, and 15, 30, 60, 120 and 180 min after an oral gavage. EDTA microvettes were spun at 2,000g at 4 °C for 5 min to obtain plasma, and samples stored at -80 °C until analysis. Blood glucose and serine concentrations were quantified using Contour Next glucometer (Bayer) and gas chromatography–mass spectrometry as described below, respectively. Plasma serine pharmacokinetics were determined for a 400 mg kg⁻¹ dose using PK solver⁵⁰.

To qualify downstream fate of serine, wild-type mice were fasted overnight, weighed in the morning, and $[U^{-13}C_3]$ serine administered via oral gavage at a dose of 400 mg kg⁻¹, with tissues collected, using Wollenberger clamps pre-cooled to the temperature of liquid nitrogen, before, and 15, 30, 45, 60, and 120 min after oral gavage, and samples stored at -80 °C until analysis.

Serum insulin and glucagon measurements

Commercially available kits were used to determine serum insulin (Mouse Insulin ELISA 10-1247-01, Mercodia) and glucagon (Glucagon ELISA 10-1271-01, Mercodia) following a 6-h fast in mice according to the manufacturer's instructions.

Lipogenesis D₂O experiments

C57BL/6J mice fed diets for 18 weeks were injected intraperitoneally with D_2O (in 0.9% NaCl) at a dose of 0.027 ml per g of body weight with drinking water replaced with 6% D_2O -enriched solution for a period of

-18 h. In the morning (07:00–10:00 h) tissues were rapidly collected using Wollenberger clamps pre-cooled to the temperature of liquid nitrogen and stored at –80 °C until analysis.

Plasma D₂O enrichment was determined using deuterium–acetone exchange protocol as previously described²⁴. In brief, 5 µl of plasma were incubated with 4 µl of 5% acetone in acetonitrile solution and 4 µl of 10 M NaOH for 24 h. Next, 500 mg of Na₂SO₄ and 600 µl of chloroform were added, and samples vortex-mixed. After 2 min centrifugation at 3,000*g*, 80 µl was transferred in triplicate into gas chromatography–mass spectrometry (GC–MS) vials, and plasma D₂O enrichment was quantified from an external standard curve on an Agilent DB-35MS column (30 m by 0.25 mm internal diameter × 0.25 µm, Agilent J&W Scientific) installed in an Agilent 7890 A gas chromatograph (GC) interfaced with an Agilent 5975 C mass spectrometer with the following temperature program: 60 °C initial, increase by 20 °C min⁻¹ to 100 °C, increase by 50 °C min⁻¹ to 220 °C, and hold for 1 min.

To quantify tissue D₂O labelling, ~20 mg of frozen tissue was homogenized with 250 μ l –20 °C methanol, 250 μ l ice-cold saline and 500 μ l -20 °C chloroform spiked with internal standards palmitate-d₃₁ (Cambridge Isotope Laboratories, DLM-215-PK) and coprostanol (Sigma, 7578). After a 5 min spin at 4 °C at 21,000g, the chloroform fraction was collected, dried, and resuspended with 500 µl of 2% H₂SO₄ in methanol for 2 h at 50 °C. Next, 100 µl of saturated NaCl and 500 µl of hexane were added, samples vortex-mixed, and upper hexane phase collected and transferred into a GC-MS vial. Fatty acid methyl esters were analysed using a Select FAME column (100 m × 0.25 mm internal diameter) installed in an Agilent 7890 A GC interfaced with an Agilent 5975 C MS using the following temperature program: 80 °C initial, increase by 20 °C min⁻¹ to 170 °C, increase by 1 °C min⁻¹ to 204 °C, then 20 °C min⁻¹ to 250 °C and hold for 10 min. The percent isotopologue distribution of each fatty acid and polar metabolite was determined and corrected for natural abundance using in-house algorithms adapted from a previous report⁵¹.

GTT and ITT

For GTT and ITT, C57BL/6J mice fed the diets for 18 weeks were fasted overnight with water provided ad libitum. In the morning animals were weighed and fasting blood glucose was determined from a tail bleed using a Contour Next glucometer (Bayer). For GTT, the animals were injected intraperitoneally with a bolus of glucose at a dose of 2 g kg⁻¹ of body weight, and blood glucose determined at 15, 30, 60, 120 and 180 min post-injection. For ITT, the animals were injected intraperitoneally with a bolus of series of 0.5 IU kg⁻¹, and blood glucose was quantified at 15, 30, 60 and 90 min post-injection as previously described⁵².

Determination of body composition and systemic metabolic rates

Lean and fat masses were determined using a EchoMRI 3-in-1 instrument (quantitative nuclear magnetic resonance (qNMR) imaging system). Comprehensive Laboratory Animal Monitoring System (CLAMS) (Oxymax, Columbus Instruments) was used to quantify systemic metabolic rates in individually housed mice during a period of 6 days. Water, food, and calorie intake were calculated from individually housed animals over a period of 6 days when subjected to CLAMS. Whole-body oxygen consumption (VO₂) and carbon dioxide (VCO₂) rates were normalized to corresponding total body weights, and RER was calculated as ratio of VCO₂ to VO₂.

Faecal bomb calorimetry and calorie absorption

Approximately 1 g faeces was desiccated overnight and ground using a mortar and pestle. Powdered sample was reconstituted into a pellet with 300 μ l ddH₂O and weighed. Pellet was placed in bomb cylinder surrounded by 2,000 ml ddH₂O (Parr 6100 Compensated Jacket Calorimeter). Heat produced by combustion was measured by change in

water temperature. The calorimeter energy equivalent, W (Cal $^{\circ}C^{-1}$), was calculated with standardized benzoic acid. The final energy content of each pellet was calculated as follows:

Gross energy = $\frac{(T_{\text{final}} - T_{\text{initial}})}{\text{sample weight}}$

Calorie absorption was calculated by subtracting gross energy (faecal calorie extraction) from calorie intake.

Microbiome analysis

DNA was extracted from 10-30 mg of stool using the MoBio PowerFecal DNA isolation kit (12830-50). Extracted DNA was quantified using a Nanodrop (ThermoFisher Scientific). The whole-genome sequencing raw data was uploaded to Qiita53, where we followed their default processing workflow. In summary, the raw reads were adapter filtered using the auto-detect parameters in fastp version 20⁵⁴ and host (mouse) filtered using minimap2 version 2.1755. The resulting sequences were aligned using Bowtie 2 version 2.4.256 to the Web of Life (WoL) reference database⁵⁷ via the Web of Life Toolkit App (https://github.com/ qiyunzhu/woltka); this step generated tables at genus, species, per genome, and per gene tables. For all analyses we used the per genome table; then for alpha diversity we removed any samples below 1,273,062 sequences per sample and for beta-diversity analysis we rarefied at the same value. Downstream analyses were performed in QIIME 2 version 2020.11⁵⁸. To asses global microbiota alterations, alpha diversity analysis was performed through Faith's PD⁵⁹ and beta diversity through robust principal component analysis (RPCA)⁶⁰ and resulting Aitchison distances were evaluated through permutational multivariate analysis of variance (PERMANOVA)61.

We then designed a Bayesian hierarchical model for differential abundance incorporating diet type as a fixed effect and cage as a random effect. We model the count generating process as a negative binomial distribution to account for overdispersion. Due to the sparsity of microbiome data, we also accounted for zero-inflation by assigning each microbe a probability of being unobserved separately from the count generating process:

 $y_{ij} = \begin{cases} 0, & \theta_j = 1\\ \text{Negative binomial}(\eta_{ij}, \phi_j), & \theta_j = 0 \end{cases}$ $\theta_j = \text{Bernoulli}(\pi_j)$

 $\log(\eta_{ii}) = x_i\beta_i + z_iu_j + \log(\text{depth}_i)$

We wrote this model using the Stan probabilistic programming language⁶² and fit the model using BIRDMAn (https://github.com/gibsramen/BIRDMAn). To account for compositionality, we fit this model using the first microbe in the table as an additive log ratio reference and converted log fold changes into centred log ratio coordinates after fitting. We used the following as prior distributions for the target parameters:

$$\pi_{j} \sim \text{Beta}(1.5, 1.5)$$
$$\phi_{j}^{-1} \sim \text{Cauchy}_{\downarrow}(0, 3)$$
$$\beta_{j} \sim \text{Normal}(0, 5)$$
$$u_{j} \sim \text{Normal}(0, 2)$$

in which *i* is the sample, *j* is the feature, *y* is the microbial count, θ is the indicator for non-biological zero, η is the mean feature count, *x* is the covariate, β is the regression coefficients to be estimated (log-fold changes), π is the probability of non-biological zero, *z* is the cage identifier variable, *u* is the random effect of cage, and ϕ is the overdispersion

parameter. In order to compare functional changes associated with strain level differential abundances a comparative genomics pathway completeness approach was taken. First, each genome was assessed via MetaCyc⁶³ pathway completeness, a proportion ranging from zero to one, by mapping characterized genes to reactions and finally to pathways. Each pathway was then correlated by Spearman's rank correlation to the beta differential abundance determined from the above model. Serine biosynthesis, glycine cleavage, and fatty acid synthesis pathways were significantly correlated to betas. To validate these correlations, the log ratio of the sum of the abundance of genomes with complete pathways (completeness = 1) vs. those without (completeness < 1) were evaluated between treatment groups.

Behavioural assays

Thermal sensation. Small sensory C fibre function was quantified by behavioural responses to heat using a thermal nociception test device (UARD) as previously described⁶⁴. In brief, the apparatus surface was warmed up to 30 °C, and animals were placed in individual testing chambers for 20–30 min prior to testing. Four separate response latency measurements were performed, and the mean of the last triplicate taken to represent response latency for each animal. All measurements were made on coded animals by an observer unaware of the treatment groups.

Tactile sensation. Animals were placed on the von Frey stand and allowed to acclimate for 20–30 min. The range of manual von Frey filaments was used: 2.44, 2.83, 3.22, 3.61, 3.84, 4.08, 4.31, 4.56, 4.74 (Kom Kare). Testing began with the 3.84 filament and the pressure applied was repeated five times. If a positive response was observed, the next lower weighted filament was used in the sequence. In the case of a negative response, the next higher weighted filament was applied. All measurements were made on coded animals by an observer unaware of the treatment groups.

Nerve conduction velocity. Conduction of a motor nerve was quantified in anaesthetized mice using EZ Anesthesia Versaflex system (Braintree Scientific, Z-7150). In brief, lightly anaesthetized mice were transferred onto a water-heated pad with anaesthesia maintained via a face mask. Two recording platinum electrodes were inserted between the animal's second, third, and fourth toes, and a grounding electrode into the skin at the neck. PowerLab stimulator delivered a 200-mV, 50-µs square-wave stimulus every 2 s. The stimulating electrode was inserted in the ankle near the Achilles tendon and subsequently into the sciatic notch at the hip, and M waves were recorded. The latency between Achilles tendon and sciatic notch was used to calculate nerve conduction velocity as described⁶⁴. All measurements were made on coded animals by an observer unaware of the treatment groups.

Corneal confocal imaging

Quantification of corneal nerves was performed in anaesthetized mice (using EZ Anesthesia Versaflex system, Braintree Scientific, Z-7150) using Retina Tomograph 3 with Rostock Cornea Module (Heidelberg Engineering) equipped with Tomocap (Heidelberg Engineering, 0220-001) as previously described⁶⁴. In brief, lightly anaesthetized mice were transferred onto a small animal platform with anaesthesia maintained via a face mask. Forty sequential images of uniform magnification and size were collected and those containing nerves of the sub-basal plexus identified. ImageJ software (ImageJ 1.53e Java 1.8.0_172) was used to quantify corneal nerve area within each image, with data presented as pixels/image. All measurements were made on coded animals and images by an observer unaware of the treatment groups.

Epidermal innervation

Quantification of epidermal innervation was performed in paw skin samples by immunostaining for the pan-neuronal protein PGP9.5,

as described previously in detail⁶⁴. In brief, paw skin samples were collected into 4% buffered paraformaldehyde (Thermo scientific, J19943-K2). Staining of epidermal nerves was performed using anti-PGP9.5 antibody (ProteinTech, 14730-1-AP; 1:500 dilution). Using 40× magnification of a light microscope, the number of PGP9.5-positive profiles present in the epidermis was calculated, length of skin section calculated, and IENF profile density expressed as profiles mm⁻¹. All measurements were made on coded slides by an observer unaware of the treatment groups.

Metabolite extraction and quantification

Plasma polar metabolites were extracted from 3 ul of plasma spiked with a known amount of 13C- and 15N-labelled standards (Cambridge Isotope Laboratories, MSK-A2-1.2). Tissue metabolite extraction was performed as described before²¹. In brief, ~20 mg of tissue was homogenized for 2 min using Precellys beads with 500 µl -20 °C methanol, 400 μ l ice-cold saline and 100 μ l ice-cold water and spiked with ¹³C/¹⁵N polar metabolite standards (Cambridge Isotope Laboratories, MSK-A2-1.2), 20 pmol of sphinganine-d7 (Avanti Polar Lipids, 860658), 2 pmol of deoxysphinganine-d3 (Avanti Polar Lipids, 860474), 100 pmol of ¹³C-dihydroceramide-d7 (Avanti Polar Lipids, 330726), 200 pmol of C15-ceramide-d7 (Avanti Polar Lipids, 860681), 10 pmol of d18:1-d7 glucosylsphingosine (Avanti Polar Lipids, 860695), 100 pmol of d18:1-d7/15:0 glucosylceramide (Avanti Polar Lipids, 330729), 100 pmol of d18:1-d7/15:0 lactosylceramide (Avanti Polar Lipids, 330727), 200 pmol of sphingosine-d7 (Avanti Polar Lipids, 860657), and 200 pmol of d18:1/18:1-d9 sphingomyelin (Avanti Polar Lipids, 791649). The identification of 1-deoxydihydroceramides was confirmed via retention time matching and analysis of m18:0/24:1 deoxyDHCer (Avanti Polar Lipids, 860464) and m18:0/16:0 deoxyDHCer (Avanti Polar Lipids, 860462) standards, and normalization for 1-deoxydihydroceramides was done with the 13C-dihydroceramide-d7 standard. Homogenate aliquot of 50 µl was taken to determine tissue protein content using BCA protein assay (Lambda Biotech, G1002). The remaining homogenate was transferred to a 2 ml Eppendorf tube and 1 ml of -20 °C chloroform was added. Samples were vortex-mixed for 5 min and spun down for 5 min at 4 °C at 15,000g. The organic phase was collected and 2 µl of formic acid was added to the remaining polar phase which was re-extracted with 1 ml of -20 °C chloroform. Combined organic phases were dried and the pellet was resuspended in 100 µl of buffer containing 100% methanol.1 mM ammonium formate and 0.2% formic acid. Data represents ion counts normalized by class-specific internal standards and tissue protein content, with stacked plots to represent acvl-chain distribution.

Gas chromatography-mass spectrometry. Quantification of polar metabolites was determined after derivatization with 2% (w/v) methoxyamine hydrochloride (Thermo Scientific) in pyridine (37 °C for 60 min) and with *N*-tertbutyldimethylsilyl-*N*-methyltrifluoroacetamid e (MTBSTFA) with 1% *tert*-butyldimethylchlorosilane (tBDMS) (Regis Technologies) (37 °C for 30 min). Polar derivatives were analysed by GC–MS using a DB-35MS column (30 m × 0.25 mm internal diameter × 0.25 μ m, Agilent J&W Scientific) installed in an Agilent 7890 A gas chromatograph interfaced with an Agilent 5975 C mass spectrometer as previously described⁶⁵. Plasma glucose enrichment was determined using propionic anhydride derivatization as previously described⁶⁶. Natural isotope abundance was corrected using in-house script⁵¹.

Targeted sphingolipid quantification. Quantification of sphingolipid metabolites was determined using triple quadrupole liquid chromatography–mass spectrometry platform (Agilent 6460). Sphingolipid species were separated on a C8 column (Spectra 3 µm C8SR 150 × 3 mm inner diameter, Peeke Scientific) as previously described⁶⁷. Mobile phase A was composed of 100% HPLC-grade water containing 2 mM ammonium formate and 0.2% formic acid and mobile phase B consisted of

100% methanol containing 0.2% formic acid and 1 mM ammonium formate. The flow rate was 0.5 ml min⁻¹. The gradient elution programme consisted of the following profile: 0 min, 82% B; 3 min, 82% B; 4 min, 90% B, 18 min, 99% B; 25 min, 99%, 27 min, 82% B, 30 min, 82% B. Column re-equilibration followed each sample and lasted 10 min. The capillary voltage was set to 3.5 kV, the drying gas temperature was 350 °C, the drying gas flow rate was 10 l min⁻¹, and the nebulizer pressure was 60 psi. Sphingolipid species were analysed by selective reaction monitoring (SRM) of the transition from precursor to product ions at associated optimized collision energies and fragmentor voltages (Supplementary Table 2). Quantification of sphingolipid species was performed using spiked-in deuterated standards.

High-resolution LC-MS/MS of polar metabolites. Around 10-20 mg of frozen tissue was extracted with 800 µl of -20 °C 5:3:2 acetonitrile: methanol:water solution spike with a known concentration of norvaline as an internal standard using the Precellys Evolution Homogenizer (Bertin Technologies)68. After extraction, a 50-µl aliquot was taken for protein quantification using BCA protein assay (Lambda Biotech, G1002), and the remaining extract was spun for 10 min at 21,000g at 4 °C. The supernatant was then transferred into a glass vial, and chromatographic separation and compound identification performed using QExactive Orbitrap MS with a Vanquish Flex Binary UHPLC system (ThermoFisher Scientific) on an iHILIC-(P) Classic, 150 mm by 2.1 mm, 5-mm particle, 200-Å (Hilicon) column at 45 °C. Chromatography was performed using a gradient of 20 mM ammonium carbonate, adjusted to pH 9.4 with 0.1% ammonium hydroxide (25%) solution (mobile phase A) and 100% acetonitrile (mobile phase B), both at a flow rate of 0.2 ml min⁻¹. The liquid chromatography gradient ran linearly from 80 to 20% B from 2 to 17 min and then from 20 to 80% B from 17 to 18 min and then held at 80% B from 18 to 25 min.

High-resolution LC–MS/MS of lipids. Liver samples were extracted in 400 μ l of -20 °C methanol using the Precellys Evolution Homogenizer (Bertin Technologies) spiked with EquiSPLASH labelled standard (Avanti Polar Lipids, 330731) and norvaline. After extraction, 50 μ l aliquot was taken to quantify protein content using BCA protein assay (Lambda Biotech, G1002), and to the remaining extract were added 400 μ l of -20 °C chloroform and 400 μ l of ice-cold water. After vortexing for 5 min, samples were spun for 5 min at 4 °C at 15,000*g*, and the organic phase was collected. Two microlitres of formic acid were added to the remaining polar phase which was re-extracted with 400 μ l of -20 °C chloroform, samples were vortex-mixed, and spun as described above. Combined organic phases were dried and the pellet was resuspended in 100 μ l of isopropanol.

Chromatographic separation and lipid species identification was performed using Q Exactive orbitrap mass spectrometer with a Vanquish Flex Binary UHPLC system (Thermo Scientific) equipped with an Accucore C30, 150 × 2.1 mm, 2.6 μ m particle (Thermo) column at 40 °C. Five microlitres of sample was injected. Chromatography was performed using a gradient of 40:60 v/v water: acetonitrile with 10 mM ammonium formate and 0.1% formic acid (mobile phase A) and 10:90 v/v acetonitrile: propan-2-ol with 10 mM ammonium formate and 0.1% formic acid (mobile phase B), both at a flow rate of 0.2 ml min⁻¹. The liquid chromatography gradient ran from 30% to 43% B from 3–8 min, then from 43% to 50% B from 8-9 min, then 50–90% B from 9–18 min, then 90–99% B from 18–26 min, then held at 99% B from 26–30 min, before returning to 30% B in 6 min and held for a further 4 min.

Lipids were analysed in positive mode using spray voltage 3.2 kV. Sweep gas flow was 1 arbitrary units, auxiliary gas flow 2 arbitrary units and sheath gas flow 40 arbitrary units, with a capillary temperature of 325 °C. Full mass spectrometry (scan range 200-2,000 m/z) was used at 70,000 resolution with 10^6 automatic gain control and a maximum injection time of 100 ms. Data dependent MS2 (Top 6) mode at 17,500 resolution with automatic gain control set at 10^5 with a maximum injection time of 50 ms was used. Data were analysed using El-Maven

software, and peaks normalized to Avanti EquiSPLASH internal standard. Lipid species specific fragments used for identification and quantification are presented in the Supplementary Table 3.

Plasma sphingoid base extraction, hydrolysis and LC-MS analysis. Plasma sphingolipids were processed as previously described with minor modifications⁶⁹. In brief, 50 µl of plasma was mixed with 0.5 ml of methanol and spiked with internal standards, sphinganine-d7, sphingosine-d7 and deoxysphinganine-d3 (Avanti lipids). The samples were placed on a mixer for 1 h at 37 °C, centrifuged at 2,800g and the supernatant collected and acid hydrolysed overnight at 65 °C with 75 µl of methanolic HCl (1N HCl,10M H₂O in methanol). Next, 100 µl of 10 M KOH was added to neutralize. 625 µl of chloroform, 100 µl of 2N NH₄OH and 500 µl of alkaline water were added, samples vortex-mixed and centrifuged for 5 min at 16,000g. The lower organic phase was washed three times with alkaline water and dried under air. LC-MS analysis was performed on an Agilent 6460 QQQ LC-MS/MS. Metabolite separation was achieved with a C18 column (Luna 100 × 2.1 mm, 3 µm, Phenomenex). Mobile phase A was composed of a 60:40 ratio of methanol:water and mobile phase B consisted of 100% methanol with 0.1% formic acid with 5 mM ammonium formate added to both mobile phases. The gradient elution programme consisted of holding at 40% B for 0.5 min, linearly increasing to 100% B over 15 min, and maintaining it for 9 min, followed by re-equilibration to the initial condition for 10 min. The capillary voltage was set to 3.5 kV, the drying gas temperature was 350 °C, the drying gas flow rate was 10 l min⁻¹, and the nebulizer pressure was 60 psi. Sphingoid bases were analysed by SRM of the transition from precursor to product ions at associated optimized collision energies and fragmentor voltages¹⁶. Sphingoid bases were then quantified from spiked internal standards of known concentration.

Serine dehydratase activity assay

Frozen liver and kidney samples were extracted in an ice-cold buffer containing 50 mM KH_2PO_4 , 1 mM Na_2EDTA , and 1mM DTT, pH 8.0 using glass homogenizer. Maximal enzyme activity was determined using coupled-enzyme reaction with lactate dehydrogenase (Sigma 10127230001) in the presence of 200 mM serine, 0.25 mM NADH, 0.17 mM pyridoxal phosphate, and 1 mM DTT for 3 min. Tissue homogenate protein quantification was subsequently determined using BCA protein assay (Lambda Biotech, G1002), and maximal enzyme activity expressed in international units (U) per mg of protein.

Gene expression analysis

RNA was extracted from -20 mg of liver tissue using Direct-Zol RNA kit (Direct-Zol RNA Miniprep Plus kit, Zymo Research) according to the manufacturer's instructions. cDNA synthesis was performed using iScript Reverse Transcription Supermix for RT–PCR (iScript Reverse Transcription Supermix, Bio-Rad) according to the manufacturer's instructions using the following protocol: 5 min at 25 °C, 20 min 46 °C, 1 min 95 °C. PCR reactions were carried out using 96-well plates on an Applied Biosystems ViiA 7 Real-Time PCR System using the following parameters: 95 °C for 20 s, 40 cycles of 95 °C for 1 s, and 60 °C for 20 s. The final volume (10 μ I) of PCR SYBR-Green reaction consisted of 5 μ I fast SYBR-Green Master Mix (Applied Biosystems), 2 μ I cDNA, 1 μ I of 5 μ M forward and reverse primers, and 1 μ I of water.

Primers used are as follows. 18s forward: AGTCCCTGCCCTTT GTACACA, 18s reverse: CGATCCGAGGGCCTCACTA; Acc1 forward: AAT GAACGTGCAATCCGATTTG, Acc1 reverse: ACTCCACATTTGCGTAATT GTTG; Acc2 forward: CGCTCACCAACAGTAAGGTGG, Acc2 reverse: GCTTGGCAGGGAGTTCCTC; Acly forward: AATCCTGGCTAAAAC CTCGCC, Acly reverse: GCATAGATGCACACGTAGAACT; actin forward: GGCTGTATTCCCTCCATCG, actin reverse: CCAGTTGGTAACAATGC CATGT; Aldh1l1 forward: AGCCACCTATGAGGGCATTC, Aldh1l1 reverse: TGAGTGTCGAGTTGAAAAACGTC; Aldh1l2 forward: ACCAGCCGGGTT TATTTCAAA, Aldh1l2 reverse: ACTCCCACTACTCGGTGGC; Dgat1 forward: CTGATCCTGAGTAATGCAAGGTT, Dgat1 reverse: TGGATG CAATAATCACGCATGG: Dgat2 forward: GCGCTACTTCCGAGACTACTT. Dgat2 reverse: GGGCCTTATGCCAGGAAACT: Dhcr7 forward: AGGCTG GATCTCAAGGACAAT, Dhcr7 reverse: GCCAGACTAGCATGGCCTG; Dhcr24 forward: CTCTGGGTGCGAGTGAAGG. Dhcr24 reverse: TTC CCGGACCTGTTTCTGGAT: Dld forward: AGCTGGAGTCGTGTGTACC. Dld reverse: GAACCTATCACTGTCACGTCA; Fasn forward: GGAGGTG GTGATAGCCGGTAT, Fasn reverse: TGGGTAATCCATAGAGCCCAG; Fdft1 forward: GTTTGAAGACCCCATAGTTGGTG, Fdft1 reverse: CACATC TACGTTCTCTGGCTTAG; Fdps forward: GGAGGTCCTAGAGTACAATGCC, Fdps reverse: AAGCCTGGAGCAGTTCTACAC; Ggps1 forward: TTCACAG GCATTTAATCACTGGC, Ggps1 reverse: ACCACGTCGGAGCTTT GAAC; Gldc forward: CTCCTGCCCAGACACGAT, Gldc reverse: GGGAC CGTCTTCTCGATGAG: Gpat1 forward: CTTGGCCGATGTAAACACACC. Gpat1 reverse: CTTCCGGCTCATAAGGCTCTC; Gpat4 forward: TCAAA GAAATTCGTCGAAGTGGT, Gpat4 reverse: CCTTTCCGGCAAAAGTA GAAGAT; Hmgcs1 forward: AACTGGTGCAGAAATCTCTAGC, Hmgcs1 reverse: GGTTGAATAGCTCAGAACTAGCC; Hmgcr forward: AGCTTGC CCGAATTGTATGTG, Hmgcr reverse: TCTGTTGTGAACCATGTGACTTC; Lss forward: TCGTGGGGGGACCCTATAAAAC, Lss reverse: CGTCCTC CGCTTGATAATAAGTC; Mthfd1 forward: CTCCTGTCCCAAGTGACATTG, Mthfd1 reverse: TAGCCTTCGTTTCCCCGTACA; Mthfd2 forward: AGT GCGAAATGAAGCCGTTG, Mthfd2 reverse: GACTGGCGGGATTGTCACC; Mthfd1l forward: GCATGGCCTTACCCTTCAGAT, Mthfd1l reverse: GTACGAGCTTCCCCAGATTGA; Mthfd2l forward: AAGGACGTTGATG GATTTCACAT, Mthfd2l reverse: GATGATTTCCCAAACGGCACT; Mthfr forward: AGATGAGGCGCAGAATGGAC, Mthfr reverse: CATCCGGT CAAACCTGGAGAT; Mtr forward: TCCTCCTCGGCCTATCTTTATTT, Mtr reverse: GGTCCGAATGAGACACGCT: Mvk forward: GGTGTGGTCG GAACTTCCC, Mvk reverse: CCTTGAGCGGGTTGGAGAC; Mvd forward: ATGGCCTCAGAAAAGCCTCAG, Mvd reverse: TGGTCGTTTTTAGCTGG TCCT: Pmvk forward: CCTATGGGGCTGTGATACAGA, Pmvk reverse: TCTCCGTGGTTCTCAATGACC; Psat forward: CAGTGGAGCGCCA GAATAGAA, Psat reverse: CCTGTGCCCCTTCAAGGA; Psph forward: TGAGTACGCAGGTTTTGATGAG, Psph reverse: TGAGTACGCAGGTTTT GATGAG; Phgdh forward: ATGGCCTTCGCAAATCTGC, Phgdh reverse: AGTTCAGCTATCAGCTCCTCC; Scd1 forward: TTCTTGCGATACACTCTG GTGC, Scd2 reverse: CGGGATTGAATGTTCTTGTCGT; Scd2 forward: GATCTCTGGCGCTTACTCAGC, Scd2 reverse: CTCCCCAGTGGTGA GAACTC; Sds forward: GAAGACCCCACTTCGTGACAG, Sds reverse: TCTTGCAGAGATGCCCAATGC: Shmt1 forward: CAGGGCTCTGCTT GATGCAC. Shmt1 reverse: CGTAACGCGCTCTTGTCAC: Shmt2 forward: TGGCAAGAGATACTACGGAGG, Shmt2 reverse: AGATCCGCTTGACATCA GACA; Sqle forward: ATAAGAAATGCGGGGATGTCAC, Sqle reverse: ATATCCGAGAAGGCAGCGAAC; Srebp1a forward: TAGTCCGAAGC CGGGTGGGCGCCGG, Srebp1a reverse: GATGTCGTTCAAAACCGCTGT GTGTC; Srebp1c forward: AAGCAAATCACTGAAGGACCTGG, Srebp1c reverse: AAAGACAAGCTACTCTGGGAG; Srebp2 forward: GGATCCTC CCAAAGAAGGAG, Srebp2 reverse: TTCCTCAGAACGCCAGACTT; Tyms forward: GGAAGGGTGTTTTGGAGGAGT, Tyms reverse: GCTGTCCA GAAAATCTCGGGA.

Western blotting

To compare tissue protein levels, -20 mg of tissue was homogenized in RIPA buffer supplemented with 5 mM EDTA solution (Thermo Scientific), protease inhibitor cocktail (cOmplete, Roche) and phosphatase inhibitor cocktail (PhosSTOP, Roche), and placed on ice for 30 min. Tissue lysate was centrifuged at 13,000g for 10 min at 4 °C, and the supernatant was stored at -80 °C. Homogenate protein content was determined using the bicinchoninic acid assay (Thermo Scientific). Protein samples were prepared in a Laemmli buffer (NuPAGE LDS Sample Buffer, Life Technologies), and were run a 4–15% precast gel (Mini-PROTEAN TGX, Bio-Rad) for 2 h at constant 100 V and transferred on a polyvinylidenedifluoride (PVDF) membrane for 2 h at constant 250 mA in an ice-chilled transfer tank. The membrane was blocked with 5% milk and incubated overnight at 4 °C with a primary antibody against ACLY (Cell Signaling 13390, 1:1,000), ACC (Cell Signaling 3662, 1:2,000), p-AKT Ser473 (Cell Signaling 9271, 1:1,000), p-AKT Ser308 (Cell Signaling 9275, 1:1,000), AKT (Cell Signaling 75692, 1:1,000), SCD1 (Cell Signaling 2794, 1:1,000), GAPDH (Cell Signaling 5174, 1:4,000), and vinculin (Cell Signaling 4650, 1:1,000). After washing with TBS-T, membranes were incubated with a horseradish peroxidase-conjugated secondary antibody (Cell Signaling 7074, 1:5,000) for 1 h at room temperature and incubated with enhanced chemiluminescence liquid (Clarity Western ECL Substrate, Bio-Rad) for 5 min. Densitometry quantification was performed using Image Lab software (Bio-Rad). For raw scans with molecular weight markers, see Supplementary Fig. 1.

Statistical analysis

Data are expressed as mean \pm s.e.m. unless stated otherwise. Statistical analysis was performed with Prism software (GraphPad Prism 9.3.1) using two-sided independent *t*-test to compare two groups, one-way ANOVA with Fisher's least significant difference post hoc test to compare more than two groups, two-way ANOVA with Fisher's least significant difference post hoc test to compare two-factor study design, and PERMANOVA analysis to explore RPCA plots. For all tests, P < 0.05 was considered significant. All data points in the manuscript represent individual biological replicates. No statistical methods were used to predetermine sample size.

Reporting summary

Further information on research design is available in the Nature Portfolio Reporting Summary linked to this article.

Data availability

Source data for microbiome algorithms and immunoblots are provided as Supplementary Information. The whole-microbiome genome sequencing raw data was uploaded to Qiita⁵³, where we followed the default processing workflow. High-resolution and targeted mass spectrometry data data is available at the NIH Common Fund's National Metabolomics Data Repository (NMDR) website, the Metabolomics Workbench, https://www.metabolomicsworkbench.org where it has been assigned Project ID M8JD81 (https://doi.org/10.21228/M8JD81). The data can be accessed directly via the Project ID M8JD81. Additional data that support the findings are available from the corresponding author upon reasonable request.

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Author contributions M.K.H. and C.M.M. designed the study. M.K.H., J.M.G., A.M.M., Y.I., K.E.F., L.S.G., P.T. and R.J.F. performed behavioural assays, GTTs and ITTs. M.K.H., G.H.M. and C.R.G. generated and analysed stable isotope tracer and targeted metabolomics and lipidomics data. C.M., G.R. and A.G. performed microbiome analysis, including phylogenetic alpha and beta-diversity and pathway analysis. T.L. and A.C. performed faecal bomb calorimetry experiments. S.P., M.W., P.M., R.K., M.L.G., N.A.C. and C.M.M. guided experimental design and analysis. M.K.H. and C.M.M. wrote the manuscript with input from all authors.

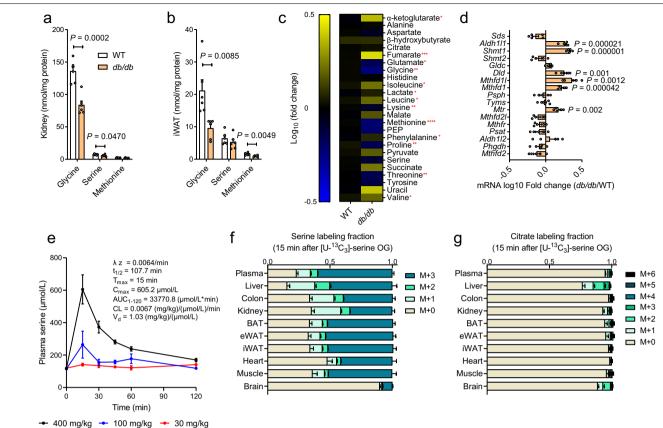
Competing interests C.M.M. is a scientific advisor for Faeth Therapeutics. The other authors declare no competing interests.

Additional information

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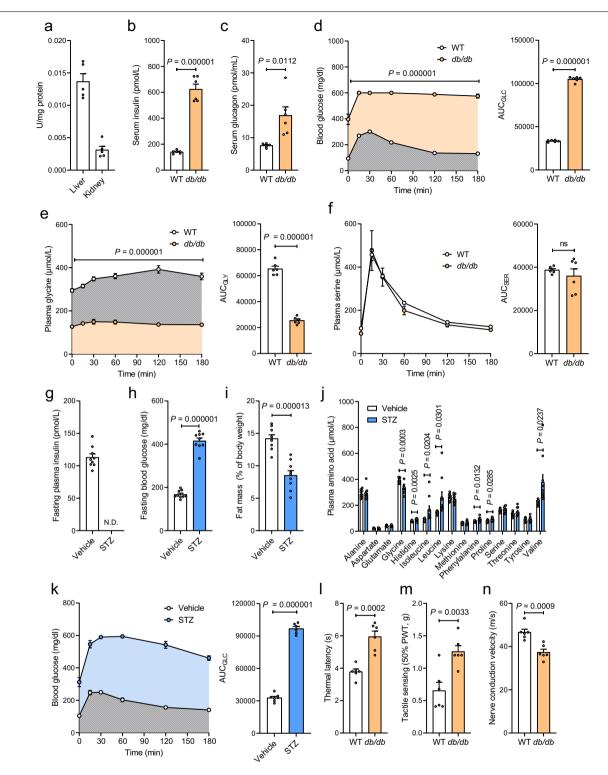
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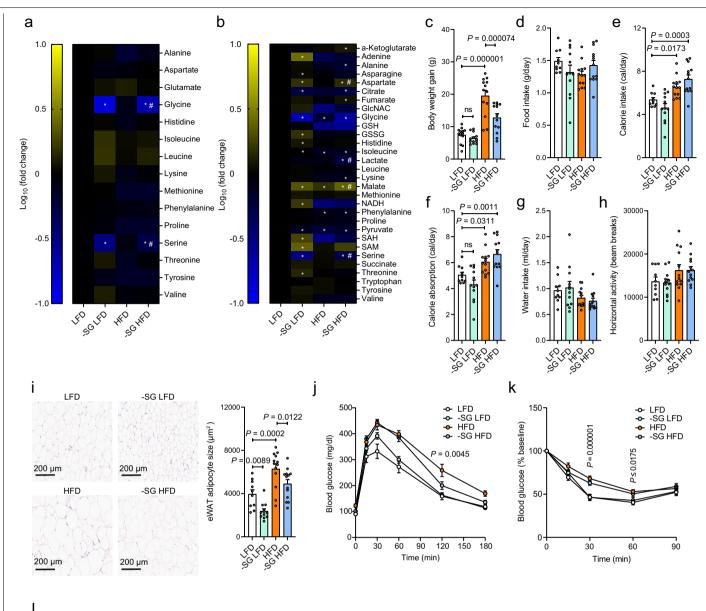
Extended Data Fig. 1 | **Serine and glycine metabolism in diabetes. (a)** Levels of glycine, serine, and methionine in WT and BKS-*db/db* mice in the kidney (n = 6 per group). (b) Levels of glycine, serine, and methionine in WT and BKS-*db/db* mice in the inguinal adipose tissue (iWAT) (n = 6 per group). (c) Plasma metabolite levels in WT and BKS-*db/db* mice (n = 6 per group). (d) mRNA expression of kidney enzymes regulating serine, glycine, and one-carbon metabolism in WT (n = 6) and BKS-*db/db* mice (n = 5). (e) Serine tolerance test (STT) in C57BL/6J mice after an overnight fast (n = 4 per dose).

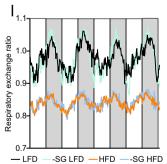
(f) Tissue serine labeling fraction in WT mice 15 min after $[U^{-13}C_3]$ serine administration via oral gavage (n = 4 per tissues) after an overnight fast. (g) Tissue citrate labeling fraction in WT mice 15 min after $[U^{-13}C_3]$ serine administration via oral gavage (n = 4 per tissues) after an overnight fast. Data are mean ± standard error of mean (SEM) and were analyzed using a two-sided independent t-test (**a**-**d**). **P* < 0.05, ***P* < 0.01, *****P* < 0.001, *****P* < 0.0001 vs. WT group.



Extended Data Fig. 2 | See next page for caption.

Extended Data Fig. 2 | **Serine tolerance test in type 1 and 2 diabetic mice.** (a) Serine dehydratase activity determined in the liver and kidney in C57BL/6J mice in the fed state (n = 5 per tissues). (b) Serum insulin in WT and BKS-*db/db* mice quantified after a 6-h fast (n = 6 per group). (c) Serum glucagon in WT (n = 5) and BKS-*db/db* (n = 6) mice quantified after a 6-h fast. (d) Plasma glucose pharmacokinetics and area under curve (AUC_{GLC}) in WT and BKS-*db/db* mice following GTT/STT with glucose dosed at 2 g/kg (n = 6 per group) after an overnight fast. (e) Plasma glycine pharmacokinetics and area under curve (AUC_{GLV}) in WT and BKS-*db/db* mice following GTT/STT with glucose dosed at 2 g/kg (n = 6 per group) after an overnight fast. (f) Serine tolerance test (STT) and area under curve (AUC_{SER}) in WT and BKS-*db/db* mice (n = 6 per group) dosed with serine (400 mg/kg) only after an overnight fast. (g) Fasting (6-h) plasma insulin level in C57BL/6J mice treated with vehicle or streptozotocin (STZ) 1 week after injection (n = 9 per group). (h) Fasting (6-h) blood glucose in C57BL/6J mice treated with vehicle or streptozotocin (STZ) 1 week after injection (n = 9 per group). (i) Body fat mass content in C57BL/6J mice treated with vehicle or streptozotocin (STZ) 1 week after injection (n = 9 per group). (j) Fasting (6-h) plasma amino acid concentration in C57BL/6J mice treated with vehicle (n = 9) or streptozotocin (STZ, n = 10) 1 week after injection. (k) Plasma glucose pharmacokinetics and area under curve (AUC_{GLC}) after an overnight fast during GTT/STT in C57BL/6J mice treated with vehicle (n = 7) or streptozotocin (STZ, n = 6) 2 weeks after injections with glucose dosed at 2 g/kg. (l) Thermal latency in 14-week-old WT and BKS-*db/db* mice (n = 6 per group). (m) Tactile sensing in 14-week-old WT and BKS-*db/db* mice (n = 6 per group). (n) Motor nerve conduction velocity in 14-week-old WT and BKS-*db/db* mice (n = 6 per group). Data are mean ± standard error of mean (SEM) and were analyzed using a two-sided independent t-test (b-n) and a two-way ANOVA with Fisher's LSD *post hoc* test (e-f, k time-course experiments).

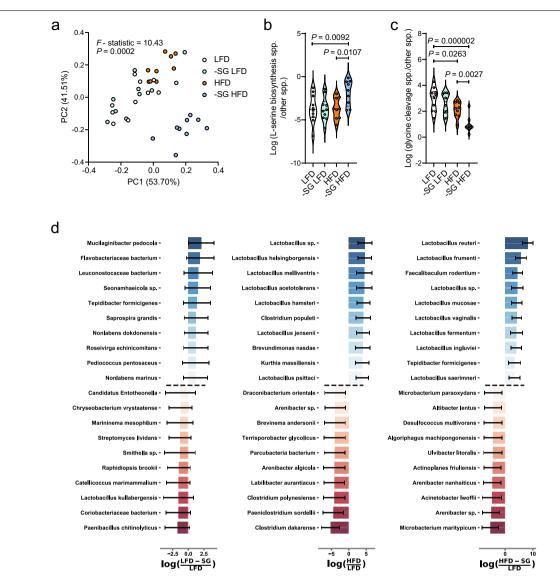




Extended Data Fig. 3 | See next page for caption.

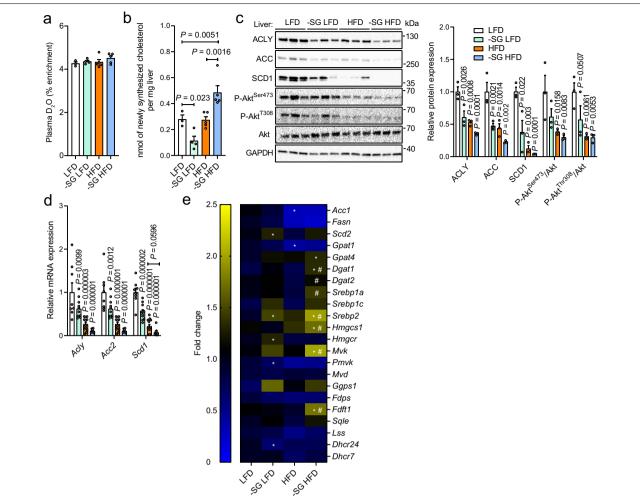
Extended Data Fig. 3 Dietary serine restriction and metabolic homeostasis. (a) Plasma amino acid level in the fed state in mice fed with a low fat diet (LFD, n = 5), serine/glycine-free LFD (-SG LFD, n = 8), high-fat diet (HFD, n = 8), and serine/glycine free HFD (-SG HFD, n = 8) for 18 weeks. (b) Liver metabolite content in mice fed with a low fat diet (LFD, n = 10), serine/glycine-free LFD (-SG LFD, n = 10), high-fat diet (HFD, n = 10), and serine/glycine free HFD (-SG HFD, n = 10) for 18 weeks. (c) Body weight gain 18 weeks after dietary intervention (n = 13 per group). (d) Food intake in response to an 18-week dietary feeding in mice with a low fat diet (LFD, n = 10), serine/glycine-free LFD (-SG LFD, n = 12), high fat diet (HFD, n = 13), and serine/glycine-free HFD (-SG HFD, n = = 13). (e) Calorie intake in response to an 18-week dietary feeding in mice with a low fat diet (LFD, n = 10), serine/glycine-free LFD (-SG LFD, n = 12), high fat diet (HFD, n = 13), and serine/glycine-free HFD (-SG HFD, n = 13). (f) Calorie absorption in response to an 18-week dietary feeding in mice with a low fat diet (LFD, n = 10), serine/glycine-free LFD (-SG LFD, n = 12), high fat diet (HFD, n = 13), and serine/ glycine-free HFD (-SG HFD, n = 13). (g) Water intake in response to an 18-week dietary feeding in mice with a low fat diet (LFD, n = 10), serine/glycine-free

LFD (-SG LFD, n = 12), high fat diet (HFD, n = 13), and serine/glycine-free HFD (-SG HFD, n = 13). (h) Physical activity in response to an 18-week dietary feeding in mice with a low fat diet (LFD, n = 10), serine/glycine-free LFD (-SG LFD, n = 12), high fat diet (HFD, n = 13), and serine/glycine-free HFD (-SG HFD, n = 13). (i) Representative images and quantification of adipocyte size in response to an 18-week dietary feeding in mice with a low fat diet (LFD, n = 10), serine/ glycine-free LFD (-SG LFD, n = = 12), high fat diet (HFD, n = 13), and serine/ glycine-free HFD (-SG HFD, n = 13). (j) I.P. glucose tolerance test 18 weeks after feeding with a low fat diet (LFD) or high fat diet (HFD) replete or deficient in serine and glycine (n = 13 per group). (k) I.P. insulin tolerance test 18 weeks after feeding with a low fat diet (LFD) or high fat diet (HFD) replete or deficient in serine and glycine (n = 15 per group). (l) Respiratory exchange ratio time course 18 weeks after feeding mice with a low fat diet (LFD, n = 10), serine/glycine-free LFD (-SG LFD, n = 12), high fat diet (HFD, n = 13), and serine/glycine-free HFD (-SG HFD, n = 13). Data are mean \pm standard error of mean (SEM) and were analyzed using a two-way ANOVA with Fisher's LSD *post hoc* test (\mathbf{a} - \mathbf{k}).*P < 0.05, **P < 0.01, *** P < 0.001, **** P < 0.0001 vs. LFD. #P < 0.05 vs. HFD group.

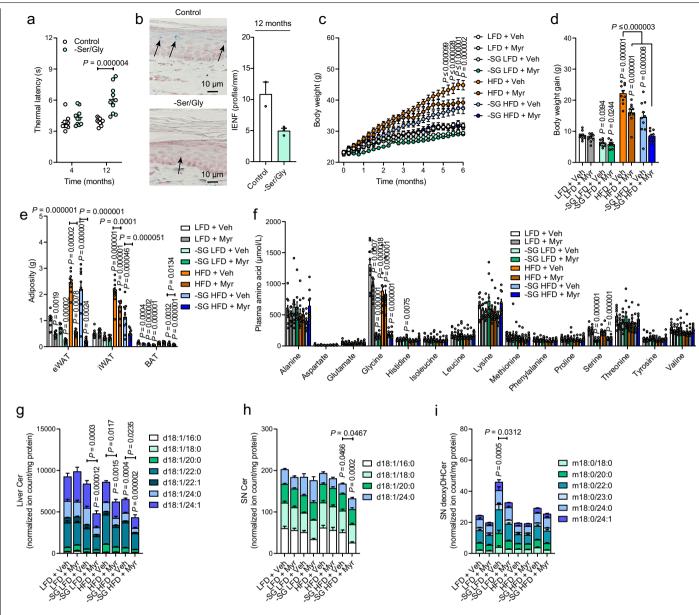


Extended Data Fig. 4 | **The impact of dietary serine restriction on microbiome composition.** (*a*) Robust principal-component analysis of microbiome betadiversity 18 weeks after feeding mice with a low fat diet (LFD, n = 10), serine/ glycine-free LFD (-SG LFD, n = 10), high fat diet (HFD, n = 9), and serine/glycinefree HFD (-SG HFD, n = 9). (*b*) Log-ratio of species with complete vs. incomplete pathways for L-serine biosynthesis 18 weeks after feeding mice with a low fat diet (LFD, n = 10), serine/glycine-free LFD (-SG LFD, n = 10), high fat diet (HFD, n = 9), and serine/glycine-free HFD (-SG HFD, n = 9). (*c*) Log-ratio of species with

complete vs. incomplete pathways for glycine cleavage 18 weeks after feeding mice with a low fat diet (LFD, n = 10), serine/glycine-free LFD (-SG LFD, n = 10), high fat diet (HFD, n = 9), and serine/glycine-free HFD (-SG HFD, n = 9). (*d*) Log fold-change of microbiome species 18 weeks after feeding mice with a low fat diet (LFD, n = 10), serine/glycine-free LFD (-SG LFD, n = 10), high fat diet (HFD, n = 9), and serine/glycine-free LFD (-SG LFD, n = 10), high fat diet (HFD, n = 9), and serine/glycine-free LFD (-SG LFD, n = 10), high fat diet (HFD, n = 9), and serine/glycine-free HFD (-SG HFD, n = 9). Data are presented as a minimum/maximum (**b**-**c**) and were analyzed using a PERMANOVA test (*a*) and a two-way ANOVA with Fisher's LSD *post hoc* test (**b**-**c**).



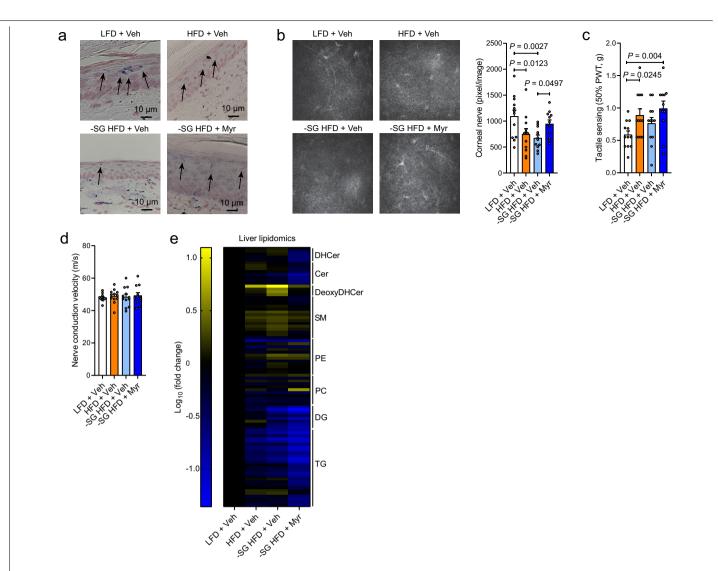
Extended Data Fig. 5 | **Dietary serine restriction remodels fatty acid and cholesterol synthesis.** (*a*) Plasma heavy water (D₂O) enrichment in mice fed a with low fat diet (LFD, n = 3), serine/glycine-free LFD (-SG LFD, n = 4), high fat diet (HFD, n = 5), and serine/glycine-free HFD (-SG HFD, n = 5). (*b*) *De novo* cholesterol synthesis in mice fed with LFD (n = 3), -SG LFD (n = 4), HFD (n = 5), and -SG HFD (n = 5) for 18 weeks. (*c*) Hepatic protein expression of ATP-citrate lyase (ACLY), acetyl-CoA carboxylase (ACC), and steroyl-CoA desaturase 1 (SCD1), P-Akt⁵⁴⁷³, and P-Akt^{T308} (n = 3 per group). (*d*) Hepatic mRNA expression of ATP-citrate lyase (*Acly*), acetyl-CoA carboxylase (*Acc2*), and steroyl-CoA desaturase 1 (*Scd1*) in mice fed with a low fat diet (LFD, n = 8), serine/glycine-free LFD (-SG LFD, n = 11), high fat diet (HFD, n = 13), and serine/glycine-free HFD (-SG HFD, n = 10). (*e*) Hepatic mRNA expression of enzymes involved in fatty acid and cholesterol synthesis in mice fed with a low fat diet (LFD, n = 8), serine/glycine-free LFD (-SG LFD, n = 11), high fat diet (HFD, n = 13), and serine/glycine-free HFD (-SG HFD, n = 10). Data are mean \pm standard error of mean (SEM) and were analyzed using a two-way ANOVA with Fisher's LSD *post hoc* test (**a**-**e**). **P* < 0.05, ***P* < 0.01, ****P* < 0.001, ****P* < 0.0001 vs. LFD. #*P* < 0.05 vs. HFD group.



Extended Data Fig. 6 | See next page for caption.

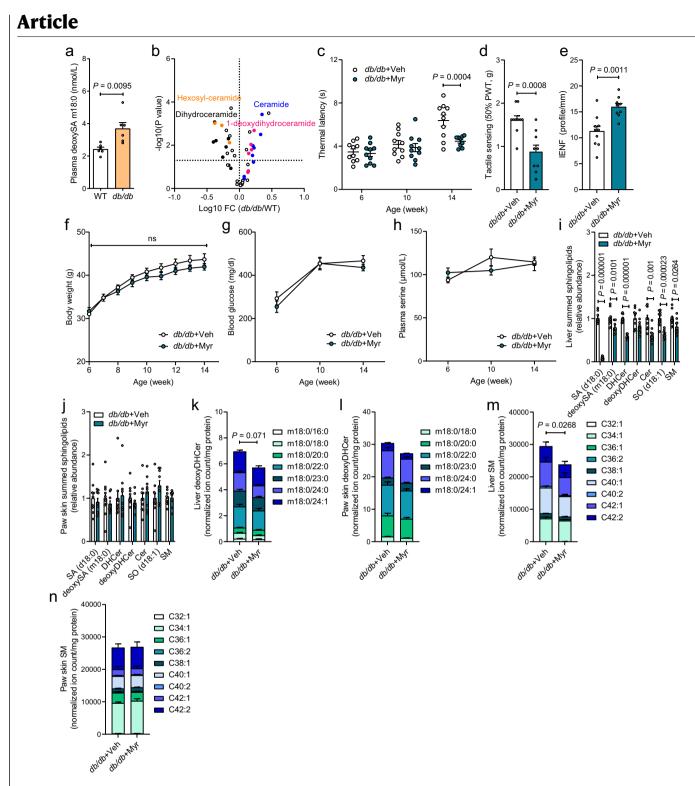
Extended Data Fig. 6 | Myriocin remodels obesity and sphingolipid metabolism in serine-associated peripheral neuropathy. (a) Thermal latency quantification in C57BL/6J mice fed with either a control diet (n = 10) or serine/glycine-free how (-Ser/Gly, n = 10) for 12 months. (b) Representative images of intraepidermal nerve fiber (IENF) density and quantification of IENF in paw skin in mice fed with either a control (n = 2) or serine/glycine free diet (n = 3) for 12 months. PGP9.5 staining of IENF is shown by arrows. (c) Body weight time course in mice fed with a low fat diet + vehicle (LFD+Veh, n = 10), LFD+0.3 mg/kg myriocin (LFD+Myr, n = 10), serine/glycine-free LFD + vehicle (-SG LFD+Veh, n = 10), -SG LFD + myriocin (-SG LFD+Myr, n = 9), high fat diet + vehicle (HFD+Veh, n = 10), HFD + myriocin (HFD+Myr, n = 10), serine/glycinefree HFD + vehicle (-SG HFD+Veh, n = 10), and -SG HFD + myriocin (-SG HFD+Myr, n = 9). (d) Body weight gain 6 months after dietary intervention in mice fed with a low fat diet + vehicle (LFD+Veh, n = 10), LFD + 0.3 mg/kg myriocin (LFD+Myr, n = 10), serine/glycine-free LFD + vehicle (-SG LFD+Veh, n = 10), -SG LFD + myriocin (-SG LFD+Myr, n = 9), high fat diet + vehicle (HFD+Veh, n = 10), HFD + myriocin (HFD+Myr, n = 10), serine/glycine-free HFD + vehicle (-SG HFD+Veh, n = 10), and -SG HFD + myriocin (-SG HFD+Myr, n = 9). (e) Adipose tissue size 6 months after dietary intervention in mice fed with a low fat diet + vehicle (LFD+Veh, n = 9), LFD + 0.3 mg/kg myriocin (LFD+Myr, n = 10), serine/glycinefree LFD + vehicle (-SG LFD+Veh, n = 10), -SG LFD + myriocin (-SG LFD+Myr, n = 9), high fat diet + vehicle (HFD+Veh, n = 10), HFD + myriocin (HFD+Myr, n = 10), serine/glycine-free HFD + vehicle (-SG HFD+Veh, n = 10), and -SG HFD + myriocin (-SG HFD+Myr, n = 9). (f) Plasma amino acid concentration 6 months after dietary intervention in mice fed a with low fat diet + vehicle (LFD+Veh,

n = 10), LFD + 0.3 mg/kg myriocin (LFD+Myr, n = 10), serine/glycine-free LFD + vehicle (-SG LFD+Veh, n = 10), -SG LFD + myriocin (-SG LFD+Myr, n = 9), high fat diet + vehicle (HFD+Veh, n = 10), HFD + myriocin (HFD+Myr, n = 10), serine/ glycine-free HFD + vehicle (-SG HFD+Veh, n = 10), and -SG HFD + myriocin (-SG HFD+Myr, n = 9). (g) Stack plot of liver ceramides in mice fed with a low fat diet + vehicle (LFD+Veh, n = 10), LFD + 0.3 mg/kg myriocin (LFD+Myr, n = 10), serine/ glycine-freeLFD+vehicle (-SGLFD+Veh, n = 10), -SGLFD+myriocin (-SGLFD+Myr, n = 9), high fat diet + vehicle (HFD+Veh, n = 10), HFD + myriocin (HFD+Myr, n = 10), serine/glycine-free HFD + vehicle (-SG HFD+Veh, n = 10), and -SG HFD + myriocin (-SG HFD+Myr, n = 9). (h) Stack plot of sciatic nerve ceramides in mice fed with a low fat diet + vehicle (LFD+Veh, n = 10), LFD + 0.3 mg/kg myriocin (LFD+Myr, n=10), serine/glycine-free LFD + vehicle (-SG LFD + Veh, n=10), -SG LFD + myriocin(-SG LFD+Myr, n = 9), high fat diet + vehicle (HFD+Veh, n = 10), HFD + myriocin (HFD+Myr, n = 10), serine/glycine-free HFD + vehicle (-SG HFD+Veh, n = 10), and -SG HFD + myriocin (-SG HFD+Myr, n = 9). (i) Stack plot of sciatic nerve deoxydihydroceramide (deoxyDHCer) in mice fed a with low fat diet + vehicle (LFD+Veh, n = 10), LFD + 0.3 mg/kg myriocin (LFD+Myr, n = 10), serine/glycinefree LFD + vehicle (-SG LFD+Veh, n = 10), -SG LFD + myriocin (-SG LFD+Myr, n = 9), high fat diet + vehicle (HFD+Veh, n = 10), HFD + myriocin (HFD+Myr, n = 10), serine/glycine-free HFD + vehicle (-SG HFD+Veh, n = 10), and -SG HFD + myriocin (-SG HFD+Myr, n = 9). Data are mean \pm standard error of mean (SEM) and were analyzed using a two-way ANOVA with Fisher's LSD post hoc test (a and c) and a one-way ANOVA with Fisher's LSD post hoc test (d-i). Statistical analyses in g-i were performed using summed sphingolipid abundances.

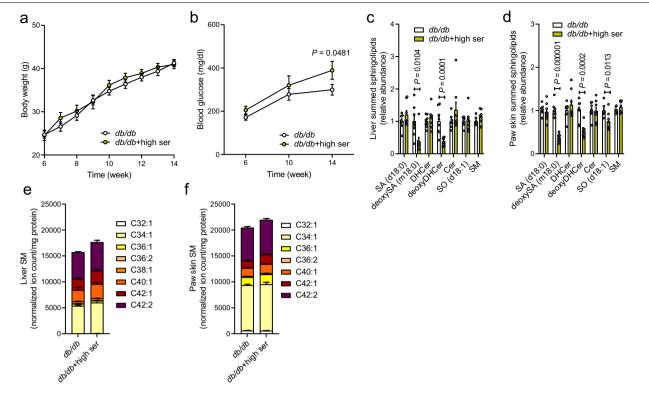


Extended Data Fig. 7 | **Myriocin improves innervation in the context of serine deficiency and alters the hepatic lipidome.** (*a*) Representative images of intraepidermal nerve fiber (IENF) density in mice fed a with low fat diet + vehicle (LFD+Veh, n = 10), high fat diet + vehicle (HFD+Veh, n = 7), serine/glycine free HFD + vehicle (-SG HFD+Veh, n = 12), and -SG HFD + myriocin (-SG HFD+Myr, n = 8). (*b*) Representative images and quantification of corneal nerves in mice fed a with low fat diet + vehicle (LFD+Veh, n = 12), high fat diet + vehicle (HFD+Veh, n = 12), serine/glycine-free HFD + vehicle (-SG HFD+Veh, n = 12), and -SG HFD + myriocin (-SG HFD+Myr, n = 11). (*c*) Tactile sensing in mice fed with a low fat diet + vehicle (LFD+Veh, n = 12), high fat diet + vehicle (HFD+Veh, n = 12),

serine/glycine-free HFD + vehicle (-SG HFD+Veh, n = 12), and -SG HFD + myriocin (-SG HFD+Myr, n = 11). (d) Motor nerve conduction velocity in mice fed with a low fat diet + vehicle (LFD+Veh, n = 12), high fat diet + vehicle (HFD+Veh, n = 12), serine/glycine-free HFD + vehicle (-SG HFD+Veh, n = 12), and -SG HFD + myriocin (-SG HFD+Myr, n = 11). (e) Liver high-resolution lipidomics analysis in the fed state in mice fed with a low fat diet + vehicle (LFD+Veh, n = 12), high fat diet + vehicle (HFD+Veh, n = 12), agrine/glycine-free HFD + vehicle (-SG HFD+Weh, n = 12), and -SG HFD+Weh, n = 12), are mean \pm standard error of mean (SEM) and were analyzed using a one-way ANOVA with Fisher's LSD *post hoc* test (**b**-**e**).



Extended Data Fig. 8 | Myriocin slows the progression of peripheral neuropathy in BKS-*db/db* mice. a) Hydrolyzed plasma deoxysphinganine (deoxySA) concentration in 16-week-old WT and BKS-*db/db* mice (n = 6 per group). b) Hepatic targeted sphingolipid determination 16-week-old WT and BKS-*db/db* mice (n = 6 per group). c) Thermal latency time-course in BKS-*db/db* mice treated with either vehicle (n = 10) or myriocin (0.3 mg/kg every other day, n = 9) for 8 weeks. d) Tactile sensing in BKS-*db/db* mice treated with either vehicle (n=10) or myriocin (n = 9) for 8 weeks. e) Intraepidermal nerve fiber density in BKS-*db/db* mice treated with either vehicle (n = 10) or myriocin (n = 9) for 8 weeks. f) Body weight time-course in BKS-*db/db* mice treated with either vehicle (n = 10) or myriocin (n = 9) for 8 weeks. g) Fasting (6-h) blood glucose time-course in BKS-*db/db* mice treated with either vehicle (n = 10) or myriocin (n = 9) for 8 weeks. h) Fasting (6-h) plasma serine time-course in BKS-*db/db* mice treated with either vehicle (n = 10) or myriocin (n = 8) for 8 weeks. i) Summed hepatic sphingolipids in BKS-*db/db* mice treated with either vehicle (n = 10) or myriocin (n = 9) for 8 weeks. **j**) Summed paw skin sphingolipids in BKS-*db/db* mice treated with either vehicle (n = 10) or myriocin (n = 9) for 8 weeks. **k**) Stack plot of fliver deoxydihydroceramide (deoxyDHCer) species in BKS-*db/db* mice treated with either vehicle (n = 10) or myriocin (n = 9) for 8 weeks. **l**) Stack plot of paw skin deoxydihydroceramide (deoxyDHCer) species in BKS-*db/db* mice treated with either vehicle (n = 10) or myriocin (n = 9) for 8 weeks. **l**) Stack plot of liver sphingomyelin (SM) species in BKS-*db/db* mice treated with either vehicle (n = 10) or myriocin (n = 9) for 8 weeks. **n**) Stack plot of paw skin sphingomyelin (SM) species in BKS-*db/db* mice treated with either vehicle (n = 9) for 8 weeks. Data are mean ± standard error of mean (SEM) and were analyzed using a two-sided independent t-test (**a-b,d-e, i-n**) and a two-way ANOVA with Fisher's LSD *post hoc* test (**c,f-h**). Statistical analyses in k-n were performed using summed sphingolipid abundances.



Extended Data Fig. 9 | Dietary serine supplementation mitigates 1-deoxysphingolipid in BKS-*db/db* liver and skin. a) Body weight time-course in BKS-*db/db* mice fed with either a control (n = 8) or serine supplemented diet (n = 9) for 8 weeks. b) Fasting (6-h) blood glucose time-course in BKS-*db/db* fed with either a control (n = 8) or serine supplemented diet (n = 9) for 8 weeks. c) Summed hepatic sphingolipids in BKS-*db/db* mice fed with either a control or serine supplemented diet for 8 weeks (n = 8 per group). d) Summed paw skin sphingolipids in BKS-*db/db* mice fed with either a control or serine supplemented diet for 8 weeks (n = 8 per group). **e**) Levels of sphingomyelin species (SM) in the liver in BKS-*db/db* mice fed with either a control or serine supplemented diet for 8 weeks (n = 8 per group). **f**) Levels of sphingomyelin species (SM) in the paw skin in BKS-*db/db* mice fed with either a control or serine supplemented diet for 8 weeks (n = 8 per group). Data are mean \pm standard error of mean (SEM) and were analyzed with a two-way ANOVA with Fisher's LSD *post hoc* test (**a**-**b**) and a two-sided independent t-test (**c**-**f**). Statistical analyses in e-f were performed using summed abundances.

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Reporting Summary

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Statistics

For	all st	atistical analyses, confirm that the following items are present in the figure legend, table legend, main text, or Methods section.
n/a	Cor	nfirmed
	\boxtimes	The exact sample size (n) for each experimental group/condition, given as a discrete number and unit of measurement
	\boxtimes	A statement on whether measurements were taken from distinct samples or whether the same sample was measured repeatedly
	\boxtimes	The statistical test(s) used AND whether they are one- or two-sided Only common tests should be described solely by name; describe more complex techniques in the Methods section.
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		For null hypothesis testing, the test statistic (e.g. F, t, r) with confidence intervals, effect sizes, degrees of freedom and P value noted Give P values as exact values whenever suitable.
\boxtimes		For Bayesian analysis, information on the choice of priors and Markov chain Monte Carlo settings
	\boxtimes	For hierarchical and complex designs, identification of the appropriate level for tests and full reporting of outcomes
\boxtimes		Estimates of effect sizes (e.g. Cohen's d, Pearson's r), indicating how they were calculated
		Our web collection on statistics for biologists contains articles on many of the points above.

Software and code

Policy information about availability of computer code

Confocal corneal imaging was performed using Retina Tomograph 3 with Rostock Cornea Module (Heidelberg Engineering Inc.) equipped with Data collection Tomocap (Heidelberg Engineering, cat. no. 0220-001). Data analysis All software is commercially or freely available, literature references are included in the Method section. Mass spectrometry data were processed using using AMDIS, El-Maven v0.11.0, and Agilent Mass Hunter. Individual figure panels were prepared using GraphPad Prism 9.3.1 and Adobe Illustrator 24.3. Quantification of corneal nerves was performed using ImageJ software (ImageJ 1.53e Java 1.8.0_172). The whole microbiome genome sequencing raw data was uploaded to Qiita, where we followed their default processing workflow. In summary, the raw reads were adaptor filtered using the auto-detect parameters in fastp version 2063 and host (mouse) filtered using minimap2 version 2.1764. The resulting sequences were aligned using Bowtie 2 version 2.4.265 to the Web of Life (WoL) reference database66 via the Web of Life Toolkit App (https://github.com/qiyunzhu/woltka); this step generated tables at genus, species, per genome, and per gene tables. For all analyzes we used the per genome table; then for alpha diversity we removed any samples below 1,273,062 sequences per sample and for beta diversity analysis we rarefied at the same value. Downstream analyses were performed in QIIME 2 version 2020.116. To asses global microbiota alterations, alpha diversity analysis was performed through Faith's PD68 and beta diversity through robust principal-component analysis (RPCA)69 and resulting Aitchison distances were evaluated through permutational multivariate analysis of variance (PERMANOVA).

For manuscripts utilizing custom algorithms or software that are central to the research but not yet described in published literature, software must be made available to editors and reviewers. We strongly encourage code deposition in a community repository (e.g. GitHub). See the Nature Portfolio guidelines for submitting code & software for further information.

Data

Policy information about <u>availability of data</u>

All manuscripts must include a <u>data availability statement</u>. This statement should provide the following information, where applicable:

- Accession codes, unique identifiers, or web links for publicly available datasets
- A description of any restrictions on data availability
- For clinical datasets or third party data, please ensure that the statement adheres to our policy

Source data for microbiome algorithms and immunoblots are provided as Supplementary Information (Supplementary Figure 1). The whole microbiome genome sequencing raw data was uploaded to Qiita, where we followed their default processing workflow. The resulting sequences were aligned using Bowtie 2 version 2.4.25 to the Web of Life (WoL) reference database (Zhu et al Nat. Commun. 10, 5477, doi:10.1038/s41467-019-13443-4) via the Web of Life Toolkit App (https://github.com/qiyunzhu/woltka).

High-resolution and targeted mass spectrometry data data is available at the NIH Common Fund's National Metabolomics Data Repository (NMDR) website, the Metabolomics Workbench, https://www.metabolomicsworkbench.org where it has been assigned Project ID (http://dx.doi.org/10.21228/M8JD81). The data can be accessed directly via it's Project DOI: (http://dx.doi.org/10.21228/M8JD81). This work is supported by NIH grant U2C-DK119886.

Additional data that support findings is available from the corresponding author upon reasonable request.

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Life sciences study design

All studies must disclose on these points even when the disclosure is negative.

Sample size	No statistical methods were used to predetermine sample size. Sample sizes were determined based on our and other investigators experience with the respective animal studies (Wallace et al. Nat Chem Biol 2018 and Calcutt et al. JCI 2017). The sample sizes were found to be adequate based on the magnitude and consistency of measurable differences between groups.
Data exclusions	No data were excluded.
Replication	All replicate experiments were successful. All experimental details necessary to replicate the results in other laboratories were provided in the Methods section. At least 3 independent biological replicates were performed in each condition.
Randomization	Sex- and age-matched mice were randomly assigned to individual dietary groups ensuring there were no baseline differences in body weight.
Blinding	The investigators were blinded to experimental conditions including paw skin sectioning, and IENF and tactile sensing quantification. The data reported for the metabolic and metabolomics experiments were based on quantitative cellular and metabolic measurements that are not subject to biases. In this context, the investigators were not blinded to group allocation, tissue collection, and processing for metabolomics or transcriptomics analysis.

Reporting for specific materials, systems and methods

We require information from authors about some types of materials, experimental systems and methods used in many studies. Here, indicate whether each material, system or method listed is relevant to your study. If you are not sure if a list item applies to your research, read the appropriate section before selecting a response.

Materials & experimental systems Methods Involved in the study Involved in the study n/a n/a Antibodies \boxtimes ChIP-seq Eukaryotic cell lines \boxtimes \boxtimes Flow cytometry \boxtimes Palaeontology and archaeology \mathbf{X} MRI-based neuroimaging Animals and other organisms \boxtimes Human research participants Clinical data \boxtimes \boxtimes Dual use research of concern

March 2021

Antibodies

Antibodies used	ACLY (Cell Signaling #13390, 1:1000), ACC (Cell Signaling #3662, 1:2000), P-AktSer473 (Cell Signaling #9271, 1:1000), P-AktSer308 (Cell Signaling #9275, 1:1000), Akt (Cell Signaling #75692, 1:1000), SCD1 (Cell Signaling #2794, 1:1000), GAPDH (Cell Signaling #5174, 1:4000), vinculin (Cell Signaling #4650, 1:1000), anti-rabbit IgG, HRP-linked Antibody (Cell Signaling #7074, 1:5000), and rabbit PGP9.5 antibody (Proteintech Cat# 14730-1-AP; 1:500)
Validation	 The manufacturer provided a validation certificate for all the antibodies used for Western applications. Antibodies for western blotting were validated for human reactivity by the manufacturer and used per their instructions. Additional information on validation (publication, certificate, manufacturer western blot) can be found on the manufacturers' websites listed below: ACLY (Cell Signaling #13390) https://www.cellsignal.com/products/primary-antibodies/atp-citrate-lyase-d1x6p-rabbit-mab/13390 ACC (Cell Signaling #3662) https://www.cellsignal.com/products/primary-antibodies/atp-citrate-lyase-d1x6p-rabbit-mab/13390 ACC (Cell Signaling #3662) https://www.cellsignal.com/products/primary-antibodies/acetyl-coa-carboxylase-antibody/3662 P-AktSer473 (Cell Signaling #9275) https://www.cellsignal.com/products/primary-antibodies/phospho-akt-ser473-antibody/9271 P-AktSer308 (Cell Signaling #9275) https://www.cellsignal.com/products/primary-antibodies/akt1-d978k-rabbit-mab/75692 ACL (Cell Signaling #75692) https://www.cellsignal.com/products/primary-antibodies/akt1-d978k-rabbit-mab/75692 SCDI (Cell Signaling #2794) https://www.cellsignal.com/products/primary-antibodies/gapdh-d16h11-xp-rabbit-mab/2794 GAP DH (Cell Signaling #4650) https://www.cellsignal.com/products/primary-antibodies/sapdh-d16h11-xp-rabbit-mab/5174 vinculin (Cell Signaling #4650) https://www.cellsignal.com/products/primary-antibodies/sapdh-d16h11-xp-rabbit-mab/5174 onti-rabbit IgG, HRP-linked Antibody (Cell Signaling #7074) https://www.cellsignal.com/products/primary-antibodies/anti-rabbit-igg-hrp-linked-antibody/7074 PGP9.5 antibody (Proteintech Cat# 14730-1-AP; 1:500) https://www.ptglab.com/products/UCHL1-Antibody-14730-1-AP.htm

Animals and other organisms

Policy information about <u>st</u>	udies involving animals; ARRIVE guidelines recommended for reporting animal research	
Laboratory animals	Ten- to sixteen-week-old C57BL/6J (JAX# 000664) or BKS-db/db mice (JAX #000642) were used in this manuscript.)
Wild animals	No wild animals were used in this manuscript.)
Field-collected samples	This manuscript did not involve field-collected samples.	
Ethics oversight	All animal experiments were approved and conducted in accordance with the Institutional Animal Care and Use Committee (IACUC) of the University of California San Diego and the Salk Institute.	

Note that full information on the approval of the study protocol must also be provided in the manuscript.