



OPEN Dipeptide metabolite, glutamyl-glutamate mediates microbe-host interaction to boost spermatogenesis

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The decrease in sperm count and infertility is a global issue that remains unresolved. By screening environmental bacterial isolates, we have found that a novel lactic acid bacterium, *Lactiplantibacillus plantarum* SNI3, increased testis size, testosterone levels, sperm count, sexual activity and fertility in mice that have consumed the bacteria for four weeks. The abundance of *L. plantarum* in the colon microbiome was positively associated with sperm count. Fecal microbiota transplantation (FMT) from *L. plantarum* SNI3-dosed mice improved testicular functions in microbiome-attenuated recipient animals. To identify mediators that confer pro-reproductive effects on the host, untargeted in situ mass spectrometry metabolomics was performed on testis samples of *L. plantarum* SNI3-treated and control mice. Enrichment pathway analysis revealed several perturbed metabolic pathways in the testis of treated mice. Within the testis, a dipeptide, glutamyl-glutamate (GluGlu) was the most upregulated metabolite following *L. plantarum* SNI3 administration. To validate the pro-reproductive feature of GluGlu, systemic and local injections of the dipeptide have been performed. γ -GluGlu increased sperm count but had no effect on testosterone. These findings highlight the role of γ -GluGlu in mediating spermatogenetic effects of *L. plantarum* on the male mouse host and –following relevant human clinical trials- may provide future tools for treating certain forms of male infertility.

Keywords Lactobacillus, mouse, testis, sperm, testosterone, in situ mass spectrometry imaging analysis.

The gut microbiome, as a symbiotic ecosystem, synthesizes and releases a plethora of biologically active compounds (vitamins, amino acids and secondary metabolites) that are involved in microbe-microbe and microbe-host communication. Accumulating evidence suggests that the microbiome is involved in multiple diseases^{1,2} thus providing a putative platform for therapeutic interventions³. In addition to local actions, gut microorganisms and their metabolites might have direct and/or indirect effects on remote organs of the host, including liver⁴, pancreas⁵, heart⁶ and brain^{7,8}.

Lactobacilli (*Lb*) are gram-positive, non-spore forming, aerotolerant/anaerobic bacteria, which are generally considered to confer beneficial metabolic adaptations in the host^{9,10}, although they represent only a minor component of the human/mammalian gut microbiome¹¹. Furthermore, significant anti-inflammatory and antioxidant effects of *Lb* have been identified¹². *Lactobacillus* ssp. downregulate reactive oxygen species

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(ROS)-forming enzymes via nuclear factor erythroid 2 (NFE2)-related factor 2 (Nrf-2)-, nuclear factor kappa B (NF- κ B)-and MAPK pathways¹³. Probiotic *Lactobacilli* immediately activate expression of anti-inflammatory cytokines such as interleukin (IL)-4, IL-10, IL11 and IL-13 and inhibit proinflammatory pathways via Treg cells¹⁴. Furthermore, the anti-inflammatory effect of *Lactobacilli* might be related to production of short chain fatty acids, such as butyrate, which strengthens gut barrier function, lowers endotoxemia and subclinical inflammation¹⁵.

Certain *Lactobacillus* species promote reproductive health. For instance, in females, *Lactobacilli* in the vagina are important for preventing infection, clearing pathogenic microbes and modulating inflammation¹⁶. However, the reproductive impact of gut microbiome in general- and *Lactobacilli* in particular, on male host is much less understood. Recent recognition of the gut -testis axis highlights the impact of the gut microbiome on male reproductive organs¹⁷.

A well-balanced and diverse gut microbiome may have direct/indirect effects on male fertility¹⁸, by influencing factors like nutrient absorption, inflammation and hormonal regulation. However, the means through which certain probiotics affect the male host, remains to be fully elucidated.

Lactic acid bacteria are capable to produce numerous different metabolites (postbiotics) through which they affect host physiology. These include –but not limited to- organic acids, amino acids, dipeptides, short chain fatty acids, bacteriocins, conjugated linoleic acids, exopolysaccharides and vitamins¹⁹. Although *Lactobacillus* metabolites have been intensively studied^{20,21}, *Lactobacillus*-induced metabolomic changes in the host remain largely unexplored.

In this report, first, we characterized the effects of a novel *Lactobacillus* strain referred to as *Lactiplantibacillus plantarum* SNI3 on gut microbiome composition, male reproduction and fertility. Fecal microbiota transplantation (FMT) was performed to confirm the role of *Lactiplantibacillus plantarum* SNI3 microbiome in mediating positive spermatogenic effect in the host. Then, using high resolution mass spectrometry imaging (MSI) analysis on testis samples we identified several metabolic pathways in the mouse testis, which are affected upon *L. plantarum* SNI3 administration. Finally, we validated a highly upregulated testicular dipeptide metabolite, γ -GluGlu in mediating *L. plantarum* SNI3 effect on spermatogenesis in the male mouse host.

Results

Isolation and characterization of *lactiplantibacillus plantarum* SNI3

In search for novel candidate probiotic *Lactobacilli*, we have screened a collection of more than 200 *Lactobacillus* strains isolated from farm- and zoo animals at Eszterházy Károly Catholic University (Eger, Hungary). In the frame of preliminary work, oligoxylan- and mannan-utilization capacity of these *Lactobacillus* strains was investigated and three strains, SK45, AT51 and SNI3, with the best prebiotic utilization capacity (Figure S1) and unique enzymatic profile (Figure S2), were selected for in vivo testing. Strain SK45 was isolated from the feces of *Casuarium casuarium*, AT51 from the feces of *Aldabrachelys gigantea* (Budapest Zoo) while SNI3 was isolated from feces of a breeding boar (*Sus scrofa domestica*, Sajóháony, Hungary). Among the selected bacteria, we recognized a specific strain (SNI3), which was prominent in decreasing body fat content and increased testis weight in male mice (Figure S3). Based on molecular taxonomy (Table S1), this strain has been categorized as *Lactiplantibacillus plantarum*, strain SNI3 (Figure S4). The total sequence length of SNI3 genome was 3,057,331 bp and the GC content of 44.8%²².

In order to test a potential probiotic use of *Lactiplantibacillus plantarum* SNI3 acid- and bile tolerance data of the strain were obtained and shown in Figure S5.

L. Plantarum SNI3 affects body composition and reproductive physiology

First, we investigated the effect of *L. plantarum* SNI3 on body functions. Adult male mice were administered *L. plantarum* SNI3 suspension (5×10^7 CFU/mL, in autoclaved tap water) for 4 weeks. Control animals received autoclaved tap water to drink (Fig. 1). The mice tolerated the bacterial suspension, there were no changes in feces color or consistency and mice did not display any signs of gastrointestinal discomfort or sickness behavior. Body weight (BW), food consumption, fluid intake and were not different between *L. plantarum* SNI3-treated and control animals (Fig. 1A and Figure S6). However, lean body mass increased ($t=3.080$, $df=8$; $p=0.015$) and fat mass decreased ($t=2.969$, $df=8$; $p=0.018$) in treated animals compared to controls as measured by the EchoMRI™ body composition analyzer (Fig. 1B). The relative weights of the adrenal glands and thymus (indicative of chronic stress²³) were not different (Figure S6). Splenomegaly, indicative of chronic immune stimulation was not detected in the treated group (Figure S6).

The most striking effect of *L. plantarum* SNI3 administration was the increased testis weight ($t=2.993$, $df=35$; $p=0.0050$) (Fig. 1C). By contrast, the normalized epididymis weight was not different in control vs. treated animals (Fig. 1C). To reveal histomorphological changes underlying increased testis size, we compared the area of seminiferous tubules and the thickness of the seminiferous epithelium on hematoxylin-eosin stained sections of the testis from control and treated mice. Both measures were significantly higher ($t=3.221$, $df=995$; $p=0.0013$; area) ($t=3.681$, $df=456$; $p=0.0003$; thickness) following *L. plantarum* SNI3 administration, indicating increased spermatogenesis (Fig. 1D).

Next, we assessed the effect of *L. plantarum* SNI3 treatment on sperm count. The number of sperm collected from the cauda epididymis was significantly higher in treated animals ($765.5 \times 10^6 \pm 0.60$ /mL) than in the controls ($280.4 \times 10^6 \pm 0.26$ /mL) ($t=7.226$ $df=35$, $p=0.0001$) (Fig. 1E). To detect any morphological alterations in sperms, smeared spermatozoa were stained with aniline-eosin. Immature acrosomes, crooked midpieces and hairpin tails were detected; however, the abundance of these defects was low and did not differ among experimental groups (3% in controls vs. 2,9% in treated animals). Triple fluorescence labeling (peanut lectin + phalloidin + DAPI) of sperm smears did not reveal overt morphological differences in sperm heads (acrosome) in control vs. *L. plantarum* SNI3 treated samples (Fig. 1E). Furthermore, computer-assisted sperm

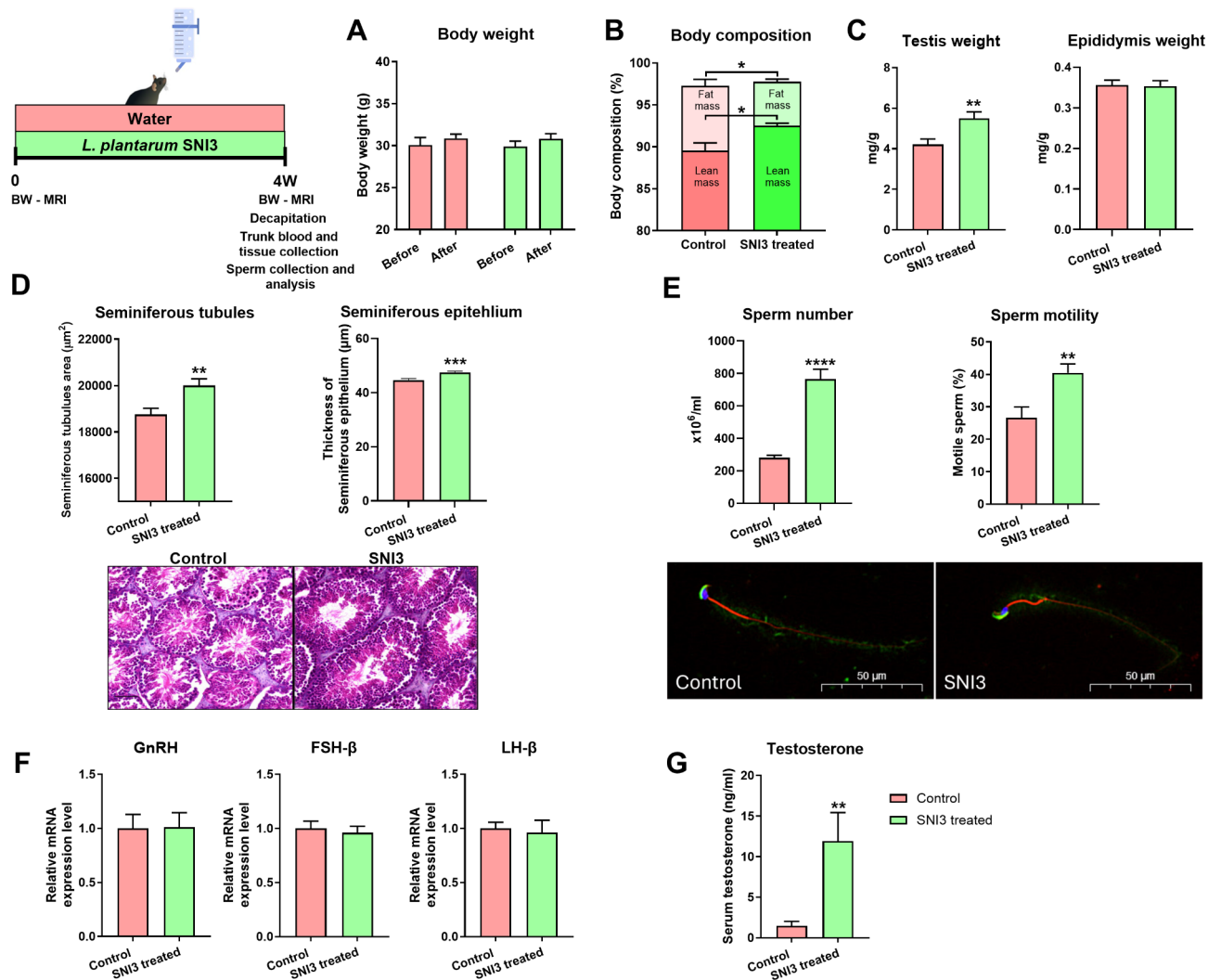


Fig. 1. *L. plantarum* SNI3 affects body composition, increases testis weight, sperm count and testosterone level. Top left: Schematics of the experimental groups and design. (A) and (B). Body weight (BW) and body composition of mice in each group. Mean \pm Standard Error of Mean (SEM). (C) Testis weight and epididymis weight of mice drinking autoclaved tap water (control) or *L. plantarum* SNI3 for 4 weeks. Mean \pm SEM values. (D) Area of seminiferous tubuli and thickness of seminiferous epithelium in control and treated mice. Mean \pm SEM values. Below: representative hematoxylin-eosin stained sections from the testes of control and *L. plantarum* SNI3-treated mice. (E) Sperm count in control and *L. plantarum* SNI3-treated mice as determined in Makler chamber; Percentage of motile sperms in control and treated groups assessed by CASA (computer-assisted sperm analysis) system. Fluorescent labeling of individual sperms obtained from control and *L. plantarum* SNI3-treated mice. Peanut lectin-FITC (green, acrosome), phalloidin-Alexafluor595 (red, actin cytoskeleton) and DAPI (blue, DNA) labeling. (F) Expression of Gonadotropin-releasing hormone (GnRH) Follicle-stimulating hormone (FSH)- and Luteinizing hormone (LH)- β subunits in control and *L. plantarum* SNI3-treated mice. Mean \pm SEM values. (G) Mean \pm SEM of serum testosterone (TESTO) levels in control and *L. plantarum* SNI3-treated mice. On all graphs: * $p < 0.05$; ** $p < 0.01$; **** $p < 0.0001$ using unpaired, two-tailed Student t-test.

analysis (CASA) revealed a higher percentage of motile sperm in *Lactobacillus* treated mice ($40.48 \pm 2.73\%$) than in controls ($26.59 \pm 3.36\%$) ($t = 3.238$, $df = 11$; $p = 0.0079$) (Fig. 1E).

As expected from the higher sperm count and motility data of *L. plantarum* SNI3-treated mice, the fertilization ratio (the number of pregnant females following 5 days cohousing with experimental males) was higher in treated mice (37%) than in controls (16.6%). The reproductivity index (the total number of viable pups born per breeding pair cohoused for 5 days) was also higher in the case of *L. plantarum* SNI3-treated (2.5) than in the controls (1.5).

Reproductive functions are controlled by the hypothalamo-pituitary-gonad axis. To test whether *L. plantarum* SNI3 administration affects the synthesis of hypothalamic gonadotropin-releasing hormone (GnRH), pituitary follicle-stimulating hormone (FSH) and luteinizing-hormone (LH), we performed quantitative real-time PCR (qRT-PCR) measurements (Table S2) on hypothalamic and pituitary samples. Expression of GnRH, FSH- and

LH- specific β subunits was not different between the control and treated mice (Fig. 1F) (GnRH: $t=0.057$, $df=22$; $p=0.954$, FSHb: $t=0.445$, $df=17$; $p=0.661$ LHb: $t=0.304$, $df=16$; $p=0.764$).

To further evaluate *L. plantarum* SNI3-dependent alterations in reproductive physiology, we measured serum testosterone (TESTO) levels. As shown in Fig. 1G, *L. plantarum* SNI3 treatment increased TESTO concentration (11.46 ± 3.40 ng/mL) compared to controls (1.46 ± 0.54 ng/mL; $t=2.751$ $df=30$; $p=0.014$).

These results suggest that *L. plantarum* SNI3 acts on the periphery, rather than through the hypothalamo-pituitary axis to increase spermatogenesis and testicular hormone levels.

L. Plantarum SNI3 administration impacts male sexual behavior

Because TESTO facilitates male sexual activity and performance, we next assessed the sexual behavior of *L. plantarum* SNI3-treated and control mice paired with estrus females. The usual sequence of the male mouse sexual behavior consists of (1) following the female, (2) anogenital sniffing, (3) mounting, (4) intromissions (5) ejaculation and (6) post-ejaculation grooming²⁴. We found a significantly increased frequency and duration of nose-to-nose contacts, anogenital sniffing and mounting in *L. plantarum* SNI3-treated mice compared to control (Fig. 2A-C). There was no significant difference between the treated animals and controls in other sexual behavior elements.

Gut microbiome is affected by *L. Plantarum* SNI3 administration

Next-generation sequencing (NGS) analysis of V3V4 16 S rRNA on proximal colon content samples revealed that *L. plantarum* SNI3 administration did not significantly affect the composition of the colon microbiome at

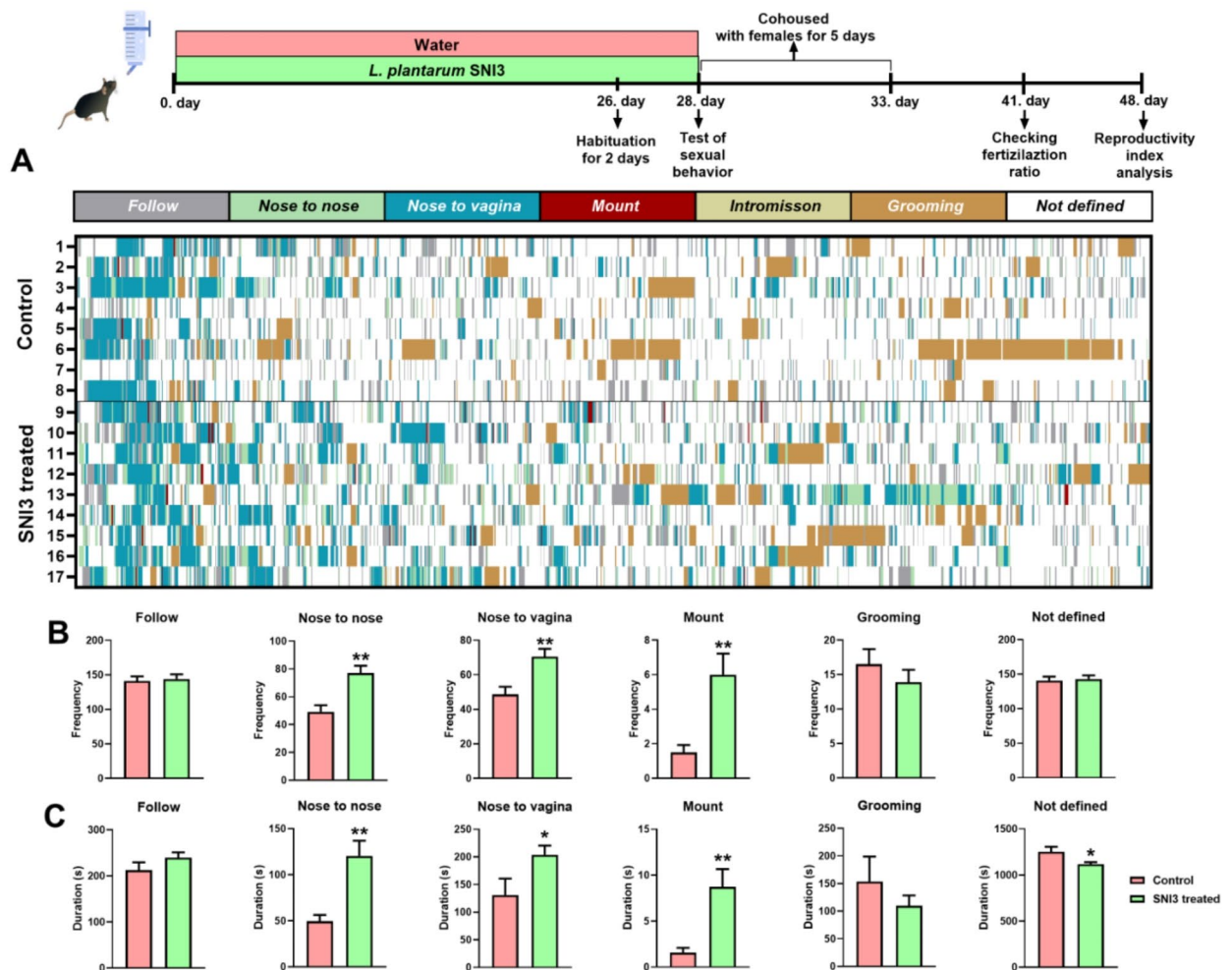


Fig. 2. *L. plantarum* SNI3 administration impacts sexual behavior. Top: Schematics of the experimental groups and design. (A) Color-coded ethograms of control and *L. plantarum* SNI3-treated mice. Quantification of sexual behavioral activity of control and *L. plantarum* SNI3-treated male mice. Six distinct behaviors that belong to sexual interaction sequence were analyzed. Each row represents one mouse. (B) and (C) Summary graphs showing frequency (B) and duration (C) of selected sexual behavior elements in control and SNI3-treated male mice. Mean \pm SEM values. Unpaired t-test between control and SNI3-treated animals. * $p < 0.05$; ** $p < 0.01$.

the phylum level (Fig. 3A). The total number of OTUs was not significantly higher in *L. plantarum* SNI3-treated animals. Alpha diversity, based on observed OTUs, Shannon, Simpson and Chao indices was not significantly different in control vs. treated mice (Figure S7A). Although Firmicutes (F) increased and Bacteroidetes (B) decreased in treated animals (Fig. 3A), F/B ratios (1.72 ± 0.40 in controls vs. 2.42 ± 0.21 in treated animals) were not statistically different. The top 20 taxa at the genus level belong to *Akkermansia*, *Lachnospiraceae* NK4A136 group, *Lactiplantibacillus*, *Prevotellaceae* NK3B31 and UCG001 groups. In the microbiome of *L. plantarum* SNI3 (*L. plantarum* SNI3) treated animals the abundance of *Lactiplantibacillus* and *Lachnospiraceae* NK4A136 group increased and *Akkermansia* significantly decreased (Fig. 3A). At family level, abundance of *Lactobacillaceae* and *Monoglobaceae* was higher, while *Akkermansiaceae* and *Eubacterium coprostanoligenes* group was significantly lower in *L. plantarum* SNI3-treated mice compared to controls (Figure S7B). *Lactiplantibacillus* genus was not detected in control samples, while its abundance was 4.6% in SNI3-treated animals. Using *L. plantarum* SNI3-specific primers (Table S2) in PCR reaction on total DNA isolated from colon content samples, we found that 10 ng stool DNA contained 4.84×10^{-6} ng *L. plantarum* SNI3 specific DNA ($R^2=0.997$, efficiency-90.6%) in the samples obtained from *L. plantarum* SNI3 treated mice. The calculated copy number was 463.3 (SD 317.7) in 1 ng stool DNA. Bacterial DNA isolated from control samples did not give any PCR product with *L. plantarum* SNI3-specific primers.

The abundance of *L. plantarum* and *Lachnospiraceae* NK4A136 group in colon content samples was positively correlated with sperm number (*L. plantarum* $r=0.5914$, $p=0.0259$; *Lachnospiraceae* NK4A136 $r=0.7735$, $p=0.0012$), while a negative correlation was seen between *Akkermansia* abundance in the colon microbiome and sperm number ($r=-0.6609$, $p=0.0101$) (Fig. 3B).

Fecal microbiota transplantation from *L. Plantarum* SNI3 treated mice improves spermatogenesis in recipient animals

Next, we used fecal microbiota transfer (FMT) to investigate whether positive reproductive changes seen after *L. plantarum* SNI3 treatment is mediated by gut microbiome. Fecal microbiota, isolated from *L. plantarum* SNI3-treated donor mice was introduced to normal mice in which the microbiome was attenuated by antibiotic mixture. As shown in Fig. 3C, fecal microbiota isolated from *L. plantarum* SNI3 treated animals increased the sperm number [(F 2, 19) = 5.500, $p=0.0067$] by 42% in antibiotic-treated recipient mice. FMT from *L. plantarum* SNI3 mice resulted in slightly but significantly increased testosterone levels [(F 2, 21) = 5.500, $p=0.0064$]. By contrast, FMT from control animals did not affect either reproductive marker.

L. Plantarum SNI3 administration affects the metabolome of testis

To explore metabolomic effects of *L. plantarum* SNI3 on male mice, in situ mass spectrometry imaging analysis (MSI) was performed on testis samples. Figure 4A shows testis sections (stained with hematoxylin-eosin) from control and *L. plantarum* SNI3-treated animals, which were included in the in situ mass spectrometry imaging. We performed hierarchical clustering analysis, component analysis by least squares discriminant analysis (sPLSDA) and ROC analysis for discriminant metabolic comparison of *L. plantarum* SNI3-treated and control groups.

Hierarchical clustering analysis illustrates a distinct separation between the control and *L. plantarum* SNI3-treated groups in the testes (Fig. 4B). Employing the sPLSDA algorithm, the data is depicted on a 2D score plot, with the x-axis representing component 1 and the y-axis representing component 2. This analysis reveals clear distinctions between the control and *L. plantarum* SNI3-treated groups (Fig. 4C).

ROC curves allow one to see how the diagnostic performance varies along all possible threshold values. The area under the ROC curve (AUC) value is a robust measure for comparing the performance of different biomarker models²⁵. Here, multivariate ROC curve exploration was performed to describe the trade-off between sensitivity and specificity with regard to biomarker performance. The processes of feature selection, model building and performance evaluation are performed multiple times by Monte-Carlo cross validation (MCCV) through balanced subsampling coupled with Random Forest (RF) algorithm. Figure 4D “ROC view” provides an overview comparing the ROC curves for all models created by MetaboAnalyst (Model 1–6 with 5, 10, 15, 25, 50 and 100 features respectively). Testis samples give high performance with AUC values > 0.965.

Identification of *L. Plantarum* SNI3 affected metabolic pathways

A correlation network, illustrated in Fig. 5, has been built on the metabolite dataset obtained from untargeted in situ mass spectrometry imaging (MSI) to reveal functionally interconnected metabolites related to *L. plantarum* SNI3 treatment in testis. Several perturbed pathways from the enrichment pathway analysis are highlighted in the correlation network. Our results indicate that glucose, galactose, fructose, palmitoyl carnitine, phosphoenol pyruvate, succinate, fumarate and other metabolites, which can take part in central metabolic pathways, were down regulated in *L. plantarum* SNI3 treated animals, however, this process left the ATP level unchanged in the testis. Arachidonic acid metabolism, linoleic acid metabolism and glycerophospholipid metabolism were also found to be downregulated as response to *L. plantarum* SNI3 treatment. By contrast, fatty acids, like palmitic acid, palmitoleic acid, stearic acid and oleic acid were upregulated in *L. plantarum* SNI3 treated mice compared to controls. It is worth noting that palmitic glucuronide was one of the highly upregulated metabolites, whose function is unknown, but glucuronidated compounds generally are destined for secretion from the body. A couple of non-proteogenic amino acids (i.e. dimethylglycine, DMG and gamma aminobutyric acid, GABA) and peptides, such as glutamyl peptides (GluGlu and GluGln) and oxidized glutathione (GSSG) were also upregulated in the testis of *L. plantarum* SNI3 treated animals.

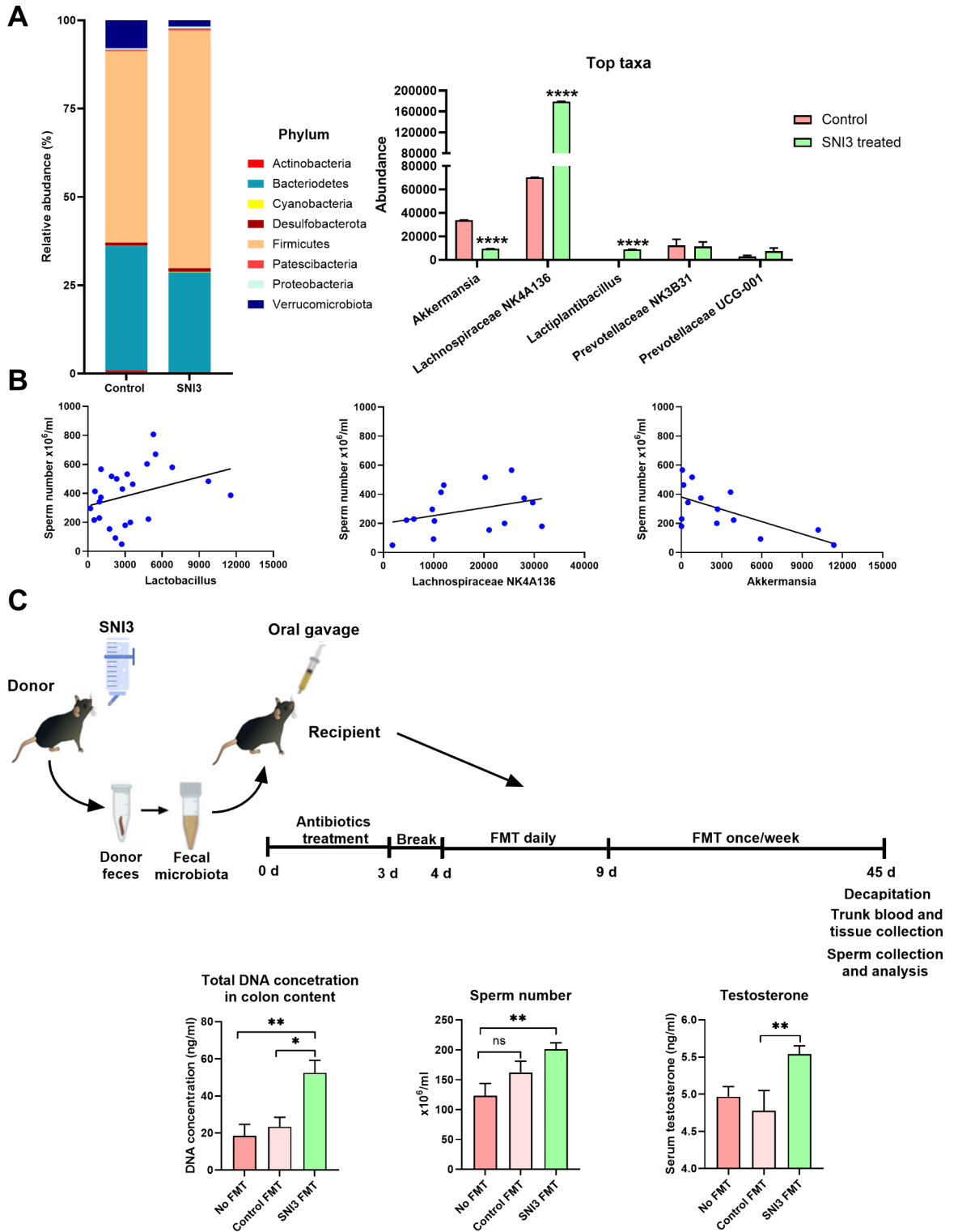


Fig. 3. *L. plantarum* SNI3 affects colon microbiome. (A) Abundance of main phyla and top 20 taxa at genus level in the colon microbiome. Mean \pm SEM values **** $p < 0.0001$ vs. control group. (B) Correlation between the abundance of different microbial populations in the colon and sperm count. Scatter plots showing the relationship between microbial population abundance and sperm number. Each point represents one individual sample ($n = 14$). (C) Impact of fecal material transplantation (FMT) from *L. plantarum* SNI3 treated mice on total bacterial DNA concentration in colon content, sperm count and serum testosterone level. No FMT: mice received antibiotic treatment and no FMT ($n = 5$), Control FMT: mice received antibiotic treatment and fecal microbiome from control, untreated animals ($n = 6$), SNI3 FMT: mice received antibiotic treatment and fecal microbiome from *L. plantarum* SNI3 treated mice ($n = 13$). All microbiome data from two independent cohorts, # FMT data were analyzed by one-way ANOVA followed by Dunnett's multiple comparison test ($n = 6-13$ per group). Mean \pm SEM values * $p < 0.05$, ** $p < 0.01$.

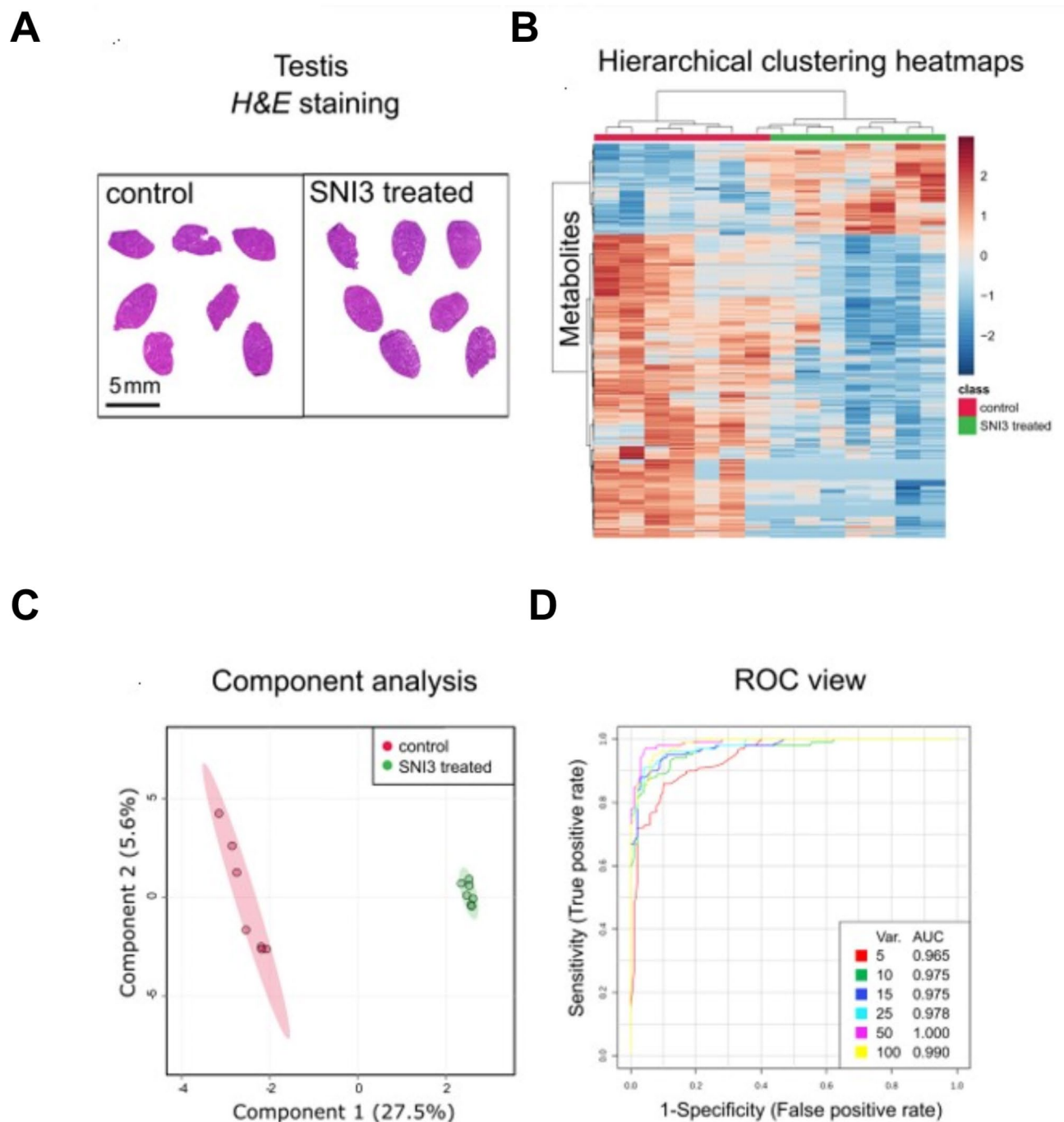


Fig. 4. Hierarchical clustering analysis, sPLSDA analysis and ROC analysis for discriminant metabolic comparison. **(A)** Hematoxylin-eosin staining of testis samples from control and *L. plantarum* SNI3-treated mice. Each section represents an individual mouse. **(B)** Hierarchical clustering analysis demonstrating different metabolic profiles of *L. plantarum* SNI3-treated and control groups on testis samples. Colored cells correspond to intensity values of metabolites. Euclidean distance and Ward method were applied for cluster analysis. **(C)** Partial least squares discriminant analysis (sPLSDA) for discriminant metabolic comparison of *L. plantarum* SNI3-treated and control groups. **(D)** An overview of ROC curves from different biomarker models using different numbers of features. ROC analysis was performed to evaluate the discerning performances based on metabolic profiles. “ROC view” provides an overview comparing the ROC curves for all models created by MetaboAnalyst (Model 1–6 with 5, 10, 15, 25, 50 and 100 features respectively). Testis samples give the performance with AUC values > 0.965.

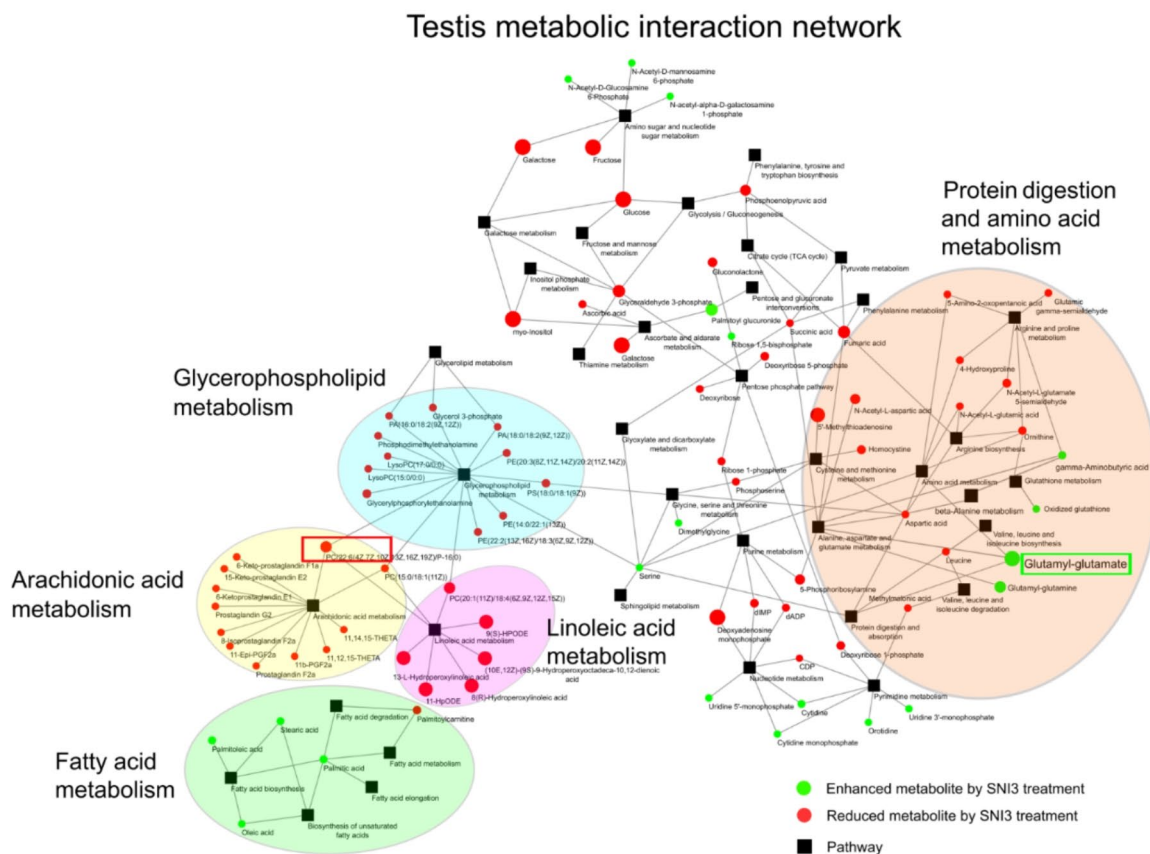


Fig. 5. Metabolic correlation network of the testis in *L. plantarum* SNI3 treatment compared with control samples. Nodes represent metabolites, with size reflecting the log₂ fold change between control and *L. plantarum* SNI3 treatment in testis samples. Node sizes increase with the log₂ fold change, while the criteria for labelling nodes are a log₂ fold change cutoff value greater than 0 for upregulation (green color) and less than 0 for downregulation (red color), respectively. Edges represent shared KEGG pathways. Selected pathways are colored as follows: arachidonic acid metabolism (yellow), linoleic acid metabolism (pink), glycerophospholipid metabolism (blue), fatty acid metabolism (green), protein digestion and amino acid metabolism (orange). Metabolites in green and red squares highlight the most upregulated (Glutamyl glutamate) and the most downregulated metabolite (Phosphatidyl choline, PC(22:6(4Z, 7Z, 10Z, 13Z, 16Z, 19Z)/16:0), respectively.

***L. Plantarum* SNI3 administration upregulates glutamyl-glutamate (GluGlu) in the testis**

Volcano plots (Fig. 6A) and pathway enrichment analysis (Fig. 6B) were performed to further investigate the enriched metabolic pathways contributing to *L. plantarum* SNI3 effect in the testis. The discriminative metabolites were selected using a volcano plot with fold change > 2 or < 0.5 and p-value < 0.05 and then subjected to metabolite annotation (HMDB database) and pathway analysis (KEGG pathway). Figure 6B summarizes the discriminative pathways in the testis samples in response to *L. plantarum* SNI3 treatment. Pentose and glucuronate interconversions and dipeptides involved in amino acid degradation are upregulated pathways in *L. plantarum* SNI3-treated testis. In contrast, amino acid, carbohydrate and linoleic acid metabolism were downregulated upon *L. plantarum* SNI3 treatment.

Figure 6C shows MSI images of select down- (phosphatidylcholine) and upregulated (glutamyl-glutamate, GluGlu) metabolites in the testis. As shown on the image, MSI signal corresponding to GluGlu seems to be localized to the seminiferous tubules. Because GluGlu was the most upregulated metabolite in the testis of *L. plantarum* SNI3 treated mice, next, we identified the isomer form of the compound and then validated its physiological role in testicular function.

To confirm the identity of GluGlu in the testes, LC-MS/MS analysis was performed using HILIC separation (Table S3). This method can separate the two isomers, α -GluGlu and γ -GluGlu, which were confirmed by chemical reference standards. Two peaks at m/z 275.088474 were detected, corresponding to the [M-H]⁻ adduct of C10H16N2O7. Extracted ion chromatograms for GluGlu indicate that both α -GluGlu and γ -GluGlu were

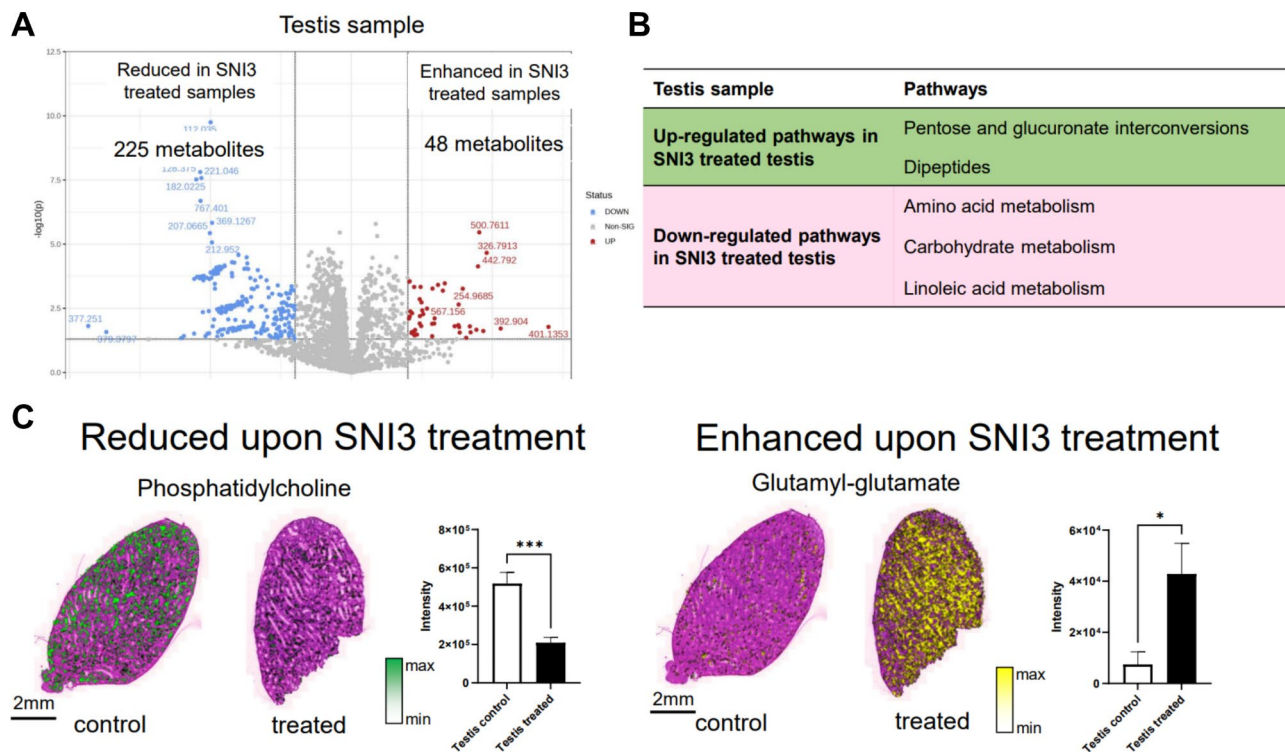


Fig. 6. Identification of differential metabolites and pathways in control vs. *L. plantarum* SNI3-treated testes. **(A)** The volcano plot is a combination of fold change (FC) and t-tests. The x-axis is log (FC). Y-axis is log₁₀ (p value) based on FDR adjusted p values. The discriminative metabolites were selected by a volcano plot with fold change > 2 or < 0.5 and p-value < 0.05. **(B)** Pathway enrichment analyses were performed by KEGG pathway analysis. Discriminative pathways are summarized here. **(C)** In situ mass spectrometry (MSI) images of select discriminative metabolites. On the left, MSI image of phosphatidylcholine, which is reduced upon *L. plantarum* SNI3 treatment; on the right, MSI image of glutamyl-glutamate, GluGlu, which is enhanced upon *L. plantarum* SNI3 treatment in the testis. Unpaired t-test was used for statistical analysis (*: $p \leq 0.05$; ***: $p \leq 0.001$).

detected in testis tissue samples, but γ -GluGlu showed eight times higher intensity than α -GluGlu (Figure S7). Furthermore, in *L. plantarum* SNI3-treated testis, the ratio γ -GluGlu/ α -GluGlu was increased (Figure S9).

Since lactic acid bacteria are capable of synthesizing γ -glutamyl dipeptides²⁶, we next checked whether *L. plantarum* SNI3 produces γ -GluGlu. HPLC analysis of the dansylated peptide revealed that the bacteria contained 188 pmol γ -GluGlu/mg of protein. γ -GluGlu was released into the culture medium which contained 555.92 nmol/mL after 24 h of culturing.

HPLC analysis also confirmed the enrichment of γ -GluGlu in the testes of mice treated with *L. plantarum* SNI3 for four weeks. The testicular γ -GluGlu content (1304 ± 107.7 pmol/mg protein in controls vs. 1794 ± 186.97 pmol/mg in SNI3-treated $t = 2.27$, $df = 3.19$; $p = 0.051$) showed a positive correlation with the abundance of *Lactiplantibacilli* in the colon microbiome. Furthermore, we observed a positive correlation between testicular γ -GluGlu content and sperm number (Figure S10).

γ -GluGlu administration affects sperm number in mice

Next, we investigated whether γ -GluGlu, the metabolite that has been significantly elevated in the testes of *L. plantarum* SNI3-treated mice, may recapitulate the effect of bacterial administration on testicular and hormonal changes. Oral administration of γ -GluGlu had no effect, whereas intraperitoneal injection of the dipeptide for 4 weeks resulted in a dose-dependent increase in sperm number (one-way ANOVA, $F(5, 36) = 3.869$; $p = 0.006$). Furthermore, direct intratesticular injection of γ -GluGlu in the dose range of 0.1–1 ng significantly increased the number of sperms isolated from the cauda epididymis compared to that of vehicle (PBS)-injected controls (one-way ANOVA, $F(3, 11) = 6.973$; $p = 0.007$) (Fig. 7). Systemic and local γ -GluGlu, however, did not significantly affect testosterone concentration (Figure S11). Following intraperitoneal injection of 10 and 50 mg/kg dose γ -GluGlu an increase of relative testis weight was detected.

Discussion

Understanding the mechanisms through which microbiome in general-, and probiotic microorganisms in particular, affect host physiology and behavior, is essential to exploit trans-kingdom interactions.

Our present research has uncovered a previously unknown *Lactobacillus* strain, *Lactiplantibacillus plantarum* SNI3, which has been found to have beneficial effects on male reproduction in a normal, healthy mouse model.

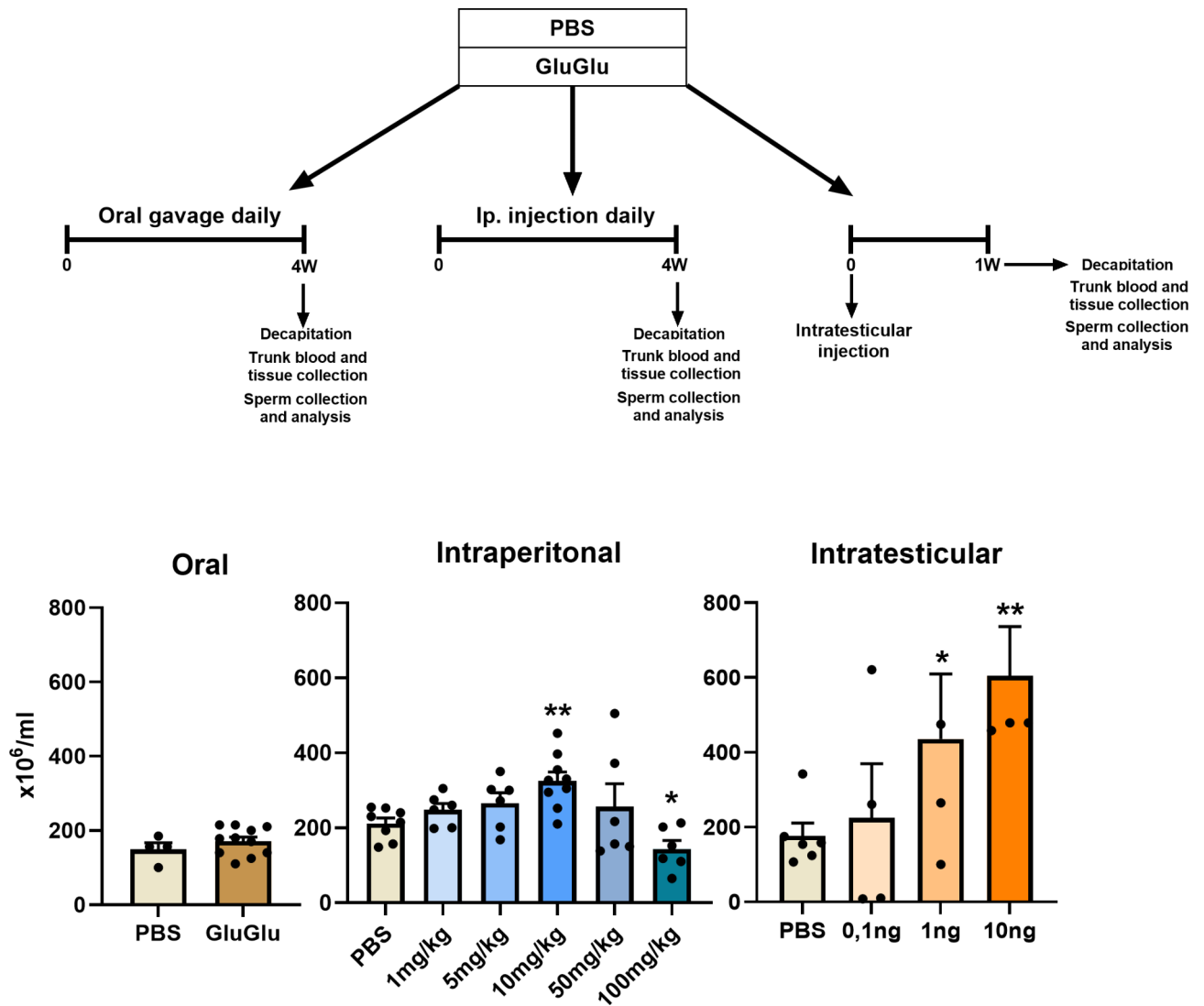


Fig. 7. Systemic and intratesticular γ -GluGlu increases spermatogenesis. C57Bl6 male mice received γ -GluGlu orally, intraperitoneally and locally (intratesticularly). Spermatozoa from the cauda epididymis were isolated and counted. Bar graphs showing the sperm number of mice injected with PBS or different doses of γ -GluGlu. Mean \pm SEM values. One way ANOVA, * $p < 0.05$; ** $p < 0.01$.

Treatment with this strain resulted in increased testis weight, sperm number, sperm motility, testosterone levels and improvements in sexual behavior, ultimately leading to advanced male fertility. In this study, we also provide evidence that a specific dipeptide metabolite, γ -GluGlu mediated the increase in sperm number in male mice treated with *L. plantarum* SNI3.

The impact of *Lactobacilli* on female reproduction has been well established, however, the influence of probiotics on male fertility received less attention. A previous study found that a *Lactobacillus reuteri* strain was able to prevent gonadal ageing in obese male mice²⁷. Additionally, other *Lactobacillus* strains, *L. rhamnosus* NCDC-610 and *L. fermentum* NCDC-400, have been shown to reduce chronic stress-induced reproductive deficits in C57Bl6 male mice²⁸. A probiotic composition containing four *Lactobacillus* strains, two *Bifidobacteria* and *Streptococcus thermophilus* also increased sperm number in a clinical trial on human patients with idiopathic oligoasthenoteratozoospermia²⁹. However, the mechanisms by which *Lactobacilli* promote testicular function and spermatogenesis remain unclear.

One possible explanation of the positive effect of *L. plantarum* SNI3 on sperm production would be direct colonization of *Lactobacillus* into testis. The notion that testes are sterile has been challenged by recent studies, which have uncovered a small community of microorganisms present in the human testes³⁰ or testicular sperm samples³¹. Following rigorous decontamination steps, ten different genera were identified in human cultured testis samples³¹. However, we could not confirm colonization /or appearance of *L. plantarum* SNI3 in the testis after oral administration. By contrast, *L. plantarum* SNI3 was detected by PCR in the colon content of treated mice, indicating successful colonization in the gut. Thus, it is very likely that beneficial effects of *L. plantarum* SNI3 on male reproductive function are mediated through the gut-testis axis^{32,33}.

The administration of *L. plantarum* SNI3 lasted for four weeks, encompassing almost a complete spermatogenesis cycle in mice (34,5 days)³⁴. The abundance of *L. plantarum* was found to be positively correlated with sperm number. Fecal microbiome transplantation (FMT) from *L. plantarum* SNI3 donor mice improved the spermatogenesis in antibiotic-treated recipient animals. These findings support the relationship between gut microbiome, *L. plantarum* SNI3 and spermatogenesis.

It should be noted that *L. plantarum* SNI3 administration reshaped the gut microbiome. Abundance of *Akkermansia* decreased, whereas that of *Lachnospiraceae* NK4A136 group significantly increased after treatment. *Lachnospiraceae* NK4A136 group produces butyrate, a beneficial short chain fatty acid (SCFA)³⁵, which improves gut barrier integrity, impacts the redox balance and have positive effect on sperm production³⁶. Increased abundance of *Lachnospiraceae* NK4A136 group following *L. plantarum* SNI3 administration might be explained by crossfeeding between these bacteria³⁷.

Although *Akkermansia muciniphila* has been associated with a healthier metabolic status and proven efficacy to improve obesity, diabetes and hepatic steatosis^{38,39}, there are no reports on the relationship between *A. muciniphila* and reproductive function in healthy male subjects.

L. plantarum SNI3 administration increased the sperm motility as well. As the sperms acquire motile ability in the epididymis, further studies are required to reveal the potential impact of *Lactobacilli* on epididymal sperm maturation and antioxidative defense.

In search for specific metabolites that mediate *L. plantarum* SNI3 effect on male reproductive functions, present, non-targeted metabolomics has revealed that a total of 273 metabolites, which exhibit differential expression in the testes of mice treated with *L. plantarum* SNI3. Pentose glucuronate interconversion and dipeptide metabolism pathways were significantly upregulated, whereas the amino acid-, carbohydrate- and linoleic acid metabolism were the most downregulated pathways in the testes. It has been observed that a greater number metabolites were downregulated than upregulated.

One of our interesting observation on testicular metabolome was that several non-proteogenic amino acids and peptides (dimethylglycine, GABA, γ -GluGlu, γ -GluGln and GSSG) - all of them having possible regulatory function by binding to protein receptors - were upregulated.

The most upregulated metabolite in the testes of *L. plantarum* SNI3 treated animals was dipeptide glutamyl-glutamate (GluGlu). GluGlu was present in α and γ form. The α form has peptide bond, while the γ form is synthesized by the transfer of glutamine to the carboxyl group at the gamma (γ) position of glutamic acid. Our LC-MS/MS analysis identified that the gamma form of GluGlu dominates the alpha form in *L. plantarum* SNI3-treated mouse testis. Previous studies have shown that some lactic acid bacteria are capable of producing various dipeptides, including γ -GluGlu²⁶. In bacteria, two enzymes are responsible for γ -GluGlu synthesis: γ -glutamyl transferase (GGT) and γ -glutamyl-cysteine ligase (GCL)⁴⁰. The impact of GGT on male reproductive functions is supported by the fact that GGT KO mice display reduced testis size, suppressed follicle-stimulating hormone (FSH) and are infertile⁴¹. Blast analysis of the *L. plantarum* SNI3 genome²² has revealed the presence of GCL protein (SNI3_14110) supporting the hypothesis of bacterial production of γ -GluGlu. HPLC analysis of *L. plantarum* SNI3 and its supernatant medium confirmed γ -GluGlu synthesis. With MSI imaging, GluGlu signal is seen in the seminiferous tubules of the testis however, the mechanisms how the dipeptide accumulates in the testicular tissue remains to be investigated.

γ -GluGlu may act locally within the testis, as local injection of this dipeptide reproduced the effect of orally administered *L. plantarum* SNI3 on sperm number. Oral administration of γ -GluGlu was not effective, probably because of the digestion of the dipeptide by enzymes of the gastrointestinal tract. Intraperitoneal application of the dipeptide resulted in a bell-shaped dose-response curve, with high dose (100 mg/kg) that was ineffective in stimulating sperm number.

Within the host testis, γ -GluGlu may enter into the γ -glutamyl cycle, which participates in amino acid transport across the cell membranes. γ -GluGlu through the glutamyl cycle facilitates the transport and availability of amino acids required for glutathione biosynthesis thus boosts antioxidant capacity and aid sperm production⁴². Indeed, protection of spermatozoa from oxidative damage is crucial for their viability and function²⁹. In addition to the testis, antioxidant mechanisms are also important in the epididymis, where they support sperm maturation and motility.

The fact that intratesticular/intraperitoneal γ -GluGlu administration increased sperm number and testis weight, but not testosterone plasma concentration, suggests that the effect of *L. plantarum* SNI3 on male reproduction is complex and that hormonal changes are mediated by distinct mechanisms and may involve other metabolic pathways and metabolites. Neither hypothalamic GnRH nor pituitary FSH and LH mRNA levels changed after *L. plantarum* SNI3 administration, suggesting that peripheral rather than central regulatory mechanisms are involved in establishment of elevated TESTO concentration. For example, a combination of probiotic *Lactobacilli* and fructooligosaccharide upregulated the expression of steroidogenic acute regulatory protein (StAR), cytochrome P450 side-chain cleavage enzyme (P450scc) and 17 β -hydroxysteroid dehydrogenase (17 β HSD) in the testes, resulting in elevated testosterone levels in male mice²⁸. In contrast, *L. plantarum* SNI3 administration did not affect host testicular expression of steroidogenic enzymes in our experiment (data not shown).

Additionally, certain intestinal bacteria can “recycle” inactive steroid glucuronates/sulphates into active hormones, which significantly contributes to steroid hormone action^{43–45}. It should be noted however that *Lactobacilli* in general⁴⁶ and *L. plantarum* SNI3 in particular, display low glucuronidase activity, therefore, other bacterial species of the host microbiome with high glucuronidase/sulphatase activity may be involved in elevation of host TESTO levels. Indeed, bacterial community isolated from the feces of *L. plantarum* SNI3-treated mice display strong β -glucuronidase activity (Figure S10). Further studies are necessary to reveal the precise peripheral molecular mechanisms that mediate the increased TESTO levels in *L. plantarum* SNI3-treated animals.

In conclusion, our present data highlight metabolic pathways through which the novel strain, *L. plantarum* SNI3 advances male host hormonal and reproductive functions and identifies γ -GluGlu as one of the metabolites, which may mediate these effects through the gut-testis axis. Additionally, our results strongly proved the concept of using “high throughput metabolome” data analysis of host animals in probiotic research, providing molecular background for health promoting effect of various bacterial strains.

Our results have a translational value, because in humans, one out of the six couples has difficulty conceiving. Half of these cases are caused by male infertility. Alarming declines in sperm count and quality have been reported in a comprehensive meta-regression analysis of men living in North America, Europe and Australia between 1973 and 2011⁴⁷. A recent (2022) examination of sperm counts revealed an accelerated pace of decline globally⁴⁸. Although our recent findings were obtained on healthy male mice, present results, after successful clinical trials, can be exploited for future microbiome-based metabolite therapies of human male subfertility.

Limitation of the study

Our study was done on healthy male mice, even in these animals, *L. plantarum* SNI3 was able to increase sperm number. Clinical experiments are needed to show if our results are transferable to human with disrupted spermatogenesis.

Materials and methods

Lactiplantibacillus plantarum SNI3

L. plantarum SNI3, used in these experiments, was isolated from feces of a breeding boar in Sajóbáony, Hungary. The strain has been deposited in National Collection of Agricultural and Industrial Microorganisms, Institute of Food Science and Technology, Hungarian University of Agriculture and Life Sciences (NCAIM (P) B 001482).

L. plantarum SNI3 cultures were grown in sterile deMan, Rogosa and Sharpe (MRS) broth (VWR Chemicals) anaerobically at 37 °C for two days to reach bacterial density of 10⁸ CFU/mL. Cultures (50 mL) were then centrifuged, the pellet was washed 2x in autoclaved tap water and re-suspended in 100 mL autoclaved tap water.

Animal experiments

Experiments in this study were approved by the Animal Care and Use Committee of the Institute of Experimental Medicine, Hungarian Research Network (permit number: PEI/001/29 – 4/2013). All procedures were complied with the ARRIVE guidelines and performed in accordance with the guidelines of European Communities Council Directive (86/609 EEC), EU Directive (2010/63/EU) and the Hungarian Act of Animal Care and Experimentation (1998; XXVIII, Sect. 243/1998).

Adult (age 150–200 days) male C57BL/6J mice were used. Animals were bred at the Specific Pathogen Free (SPF) level in the animal facility of the Institute of Experimental Medicine, Budapest Hungary. Experiments were carried out at the Minimal Disease (MD) level of the same facility under standard controlled conditions with 12 h light/dark cycle (lights on from 6 a.m. to 6 p.m.) at 21–22 °C and 65% humidity. Animals received standard pelleted rodent chow (VRF1, special Diets Services (SDS), Witham, Essex, UK) containing 19.1 g% protein, 55.3 g% carbohydrate and 4.8 g% fat. Chow was provided *ad libitum*. Mice were randomly assigned to experimental groups. *L. plantarum* SNI3-treated mice ($n = 20$) received bacterial suspension as the sole drinking solution for four weeks. Based on the fluid consumption data (10 mL/day/animal), the average *L. plantarum* SNI3 consumption was $\sim 5 \times 10^8$ CFU/mouse/day. Control animals ($n = 17$) drank autoclaved tap water. Fluid and chow consumption were measured daily, during the whole 4 weeks' treatment. All drinking bottles were changed daily at the beginning of the dark (active) phase.

Body weight was measured weekly and at the end of the experiment. Whole body composition of the mice was measured before starting *L. plantarum* SNI3 treatment and at the end of the experiment using EchoMRI™ (Whole body composition analyzer; E26-233RM, Echo Medical Systems, Houston, TX, USA).

For testing the sexual behavior, female C57BL/6J mice were used.

Test of sexual behavior

A separate cohort of mice ($n = 17$) was used in this experiment. Estrus cycle of C57BL/6J female mice (age between 60 and 90 days) was followed by daily vaginal lavage and microscopic analysis of the smears for at least 2 consecutive cycles. Only females displaying normal 4 days' cycles were included in the study. Both experimental males and females were separately habituated to a rectangular open field box (40 cm x 40 cm x 40 cm) for 30 min at two consecutive days prior to experiment. In the test, male mouse was placed first to the arena, left freely exploring for 5 min then estrus female was introduced. All tests were performed in the first hour of the dark phase of the circadian cycle. Sexual interactions were videotaped for 30 min with a Noldus Media recorder camera. Duration and frequency of behavioral elements were analyzed by Solomon coder.

To establish fertilization ratio and reproductivity index, randomly selected female mice were cohoused with experimental males for 5 consecutive days. The number of pregnant females was counted on day 15 and then the number of pups was also counted on the day of delivery.

Fecal microbiota transplantation

To establish if gut microbiome mediates pro-reproductive effects of *L. plantarum* SNI3, fecal microbiota transplantation (FMT) was done in a separate cohort of adult male mice. The FMT procedure was done as described by⁴⁹. For donor stool preparation ~ 150 mg fecal pellet form control or *L. plantarum* SNI3-treated mice was collected into sterile Eppendorf tubes and soaked into 1 ml ice cold saline, homogenized via vortexing for 1 min and centrifuged (500x g, 5 min) to remove any particulate matter. Then the bacterial suspension was washed twice in saline and the concentration was set to $\sim 10^9$ CFU/mL by measuring the OD of the solution at 600 nm.

Recipient mice were treated with an antibiotic mixture (ampicillin, 1 g/L; gentamycin, 0.5 g/L; vancomycin, 0.5 g/L; metronidazole, 1 g/L) through oral gavage (250 μ l/animal) for three consecutive days. 24 h after the last antibiotic treatment mice were transplanted with donor bacterial samples via oral gavage (200 μ l/animal, 5×10^8 CFU/animal). Recipient animals were given donor bacterial solution every day for 5 days, then once weekly until decapitation 36 days later. Recipient mice were divided into two groups: one group was transplanted with microbiota from control animals (Control FMT, $n=6$), the other group received microbiota from *L. plantarum* SNI3 treated mice (SNI3 FMT, $n=13$). An additional group of mice received antibiotic pretreatment, but did not receive any microbiome (No FMT, $n=5$).

γ -GluGlu administration

Separate cohort of adult male C57BL/6 mice ($n=78$) were used for testing the effects of γ -GluGlu. γ -GluGlu (Acros Organics) was either orally administered ($n=15$) or intraperitoneally injected ($n=41$) or directly given into the testis ($n=22$). For oral administration, γ -GluGlu (1 mg/kg bw) was delivered via oral gavage (200 μ l/mouse), daily, for 4 weeks. Controls received 200 μ l autoclaved phosphate buffered saline (PBS) via gavage. For intraperitoneal injection, γ -GluGlu was dissolved in PBS and used in 1 mg/kg – to 100 mg/kg dose range. 300 μ l/mouse γ -GluGlu solution or PBS was injected daily. For intratesticular injections, animals were anesthetized with ketamine/xylazine cocktail (16.6 mg/mL ketamine and 0.6 mg/mL xylazine-hydrochloride in 0.9% NaCl, 10 ml/kg body weight i.p.). A midline incision was made through which testes were exposed and placed on moisturized sterile gauze and injected with γ -GluGlu, 100pg-10 ng/25 μ L in PBS) or with PBS vehicle (25 μ L/testis) using a Hamilton syringe. The abdominal muscles were sutured with absorbable yarn and the skin was closed with surgical clamps. Operated animals were checked daily for signs of behavioral discomfort (changes in home cage locomotor activity, grooming, writhing, appearance of fur⁵⁰). Intratesticularly injected mice were sacrificed one week after injection, blood was collected for testosterone measurement and sperms were collected from the cauda epididymis and counted as described above.

Decapitation, autopsy and tissue collection

Animals were decapitated and trunk blood was collected, centrifuged and serum samples were stored at -20°C until hormone assay. Caudal part of the epididymis was dissected for sperm collection. Testes were collected, measured and frozen in liquid N_2 for 30 min then kept at -70°C until MALDI-MSI analysis. Colon content (approx. 200 mg) from the proximal part was collected, frozen in dry ice then kept at -70°C until assay.

Thymus, spleen and adrenals were also dissected, measured and normalized organ weights were calculated as organ weight in mg/g body weight.

Brains and the whole pituitaries were also collected. Hypothalamus was dissected along the optic chiasm rostrally, the mammillary bodies caudally and the optic tract laterally. Tissues were collected on dry ice and stored at -70°C .

Serum hormone measurement

Serum testosterone was measured by ELISA (NovaTec, Immundiagnostica GmBH, Dietzenbach, Germany) according to the manufacturer's instruction.

Sperm counting and staining

Groups of control and *L. plantarum* SNI3-treated mice were sacrificed for spermatozoa preparation. Scrotum was incised, left cauda of epididymis expelled and removed into 100 μ l Card & Fertiup medium (CosmoBio Co, USA) minced to free spermatozoa at 37°C for 5 min. Solution was diluted 1:5 with saline and the number of spermatozoa was counted in Makler chamber and on smears made on defatted, uncoated slides⁵¹. Additional smears were stained with aniline-eosin (5% aniline and 0.5% eosin in 4% acetic acid). Slides were scanned with Pannoramic[®] MIDI II Slide Scanner. Images were analyzed with Caseviewer 2.3 software. Counting and quality analysis were performed by two independent investigators, who were blinded to treatments.

Sperm smears were briefly fixed with 4% paraformaldehyde, permeabilized with 0.1% TritonX 100 then incubated with AlexaFluor568-Phalloidin (1:200, ThermoFisher) and PNA (peanut agglutinin)-FITC (1:400, Sigma-Aldrich) and counterstained with DAPI-Fluoromount-G (1:1000, Southern Biotech). Smears were scanned with Pannoramic[®] MIDI II Slide Scanner. Images were analyzed with Caseviewer 2.3 software.

For computer assisted sperm analysis (CASA Microptic SCA), samples were prepared as above and transferred into pre-warmed counting chamber, where twenty images from each sample were obtained for evaluation of sperm count, motility and velocity.

Gene expression analysis

Frozen hypothalamic and pituitary tissue samples ($n=20$) were homogenized in TRI reagent. Then, total mRNA was isolated from the homogenate using a Total mRNA Mini Kit (Geneaid) according to the manufacturer's instructions. To eliminate genomic DNA contamination, DNase I (Fermentas) treatment was used. Sample quality control and the quantitative analysis were carried out by NanoDrop (Thermo Scientific). cDNA synthesis was performed with High Capacity cDNA Reverse Transcription Kit (Applied Biosystems). Real-Time PCR was carried out in ABI StepOnePlus instrument (Applied Biosystems) with Fast EvaGreen quantitative PCR master mix (Biotium) and gene-specific primers. Primers (Microsynth) were designed in our laboratory using Primer-BLAST software of the National Center for Biotechnology Information (NCBI). Forward and reverse primers used to quantify mRNA are listed in Table S2. Gene expression was analyzed by the $2^{-\Delta\Delta\text{CT}}$ method using the ABI StepOne Software v2.3 (Applied Biosystems). The amplicons were tested by melt curve analysis on ABI StepOnePlus instrument (Applied Biosystems). Relative changes in gene expression were normalized against GAPDH mRNA expression.

PCR measurement of *Lactiplantibacillus plantarum* SNI3 from colon content samples

Total DNA was extracted from 220 mg of colon content using the QIAamp Fast DNA Stool Mini Kit. (Qiagen), following the manufacturer's protocol. The QIAamp DNA Stool Mini Kit provides silica membrane-based purification of up to 30 µg genomic, bacterial, viral and parasite DNA from fresh or frozen human stool or other sample types with high concentrations of PCR inhibitors. The combined action of InhibitEX, a unique adsorption resin and an optimized buffer leads to removal of PCR inhibitors. The concentration and quality of the extracted genomic DNA were assessed using a NanoDrop spectrophotometer (Thermo Fisher). The sequence of *L. plantarum* SNI3- specific primers is listed in Table S2.

Statistical analysis of physiological/behavioral measurements

Data are expressed as mean ± SEM and analyzed by two-tailed, unpaired Student's *t*-test (control vs. *L. plantarum* SNI3-treated) using GraphPad Prism software (version 9.4.0; San Diego, CA, USA). *P*-value < 0.05 was considered statistically significant. For FMT results and sperm counts after intraperitoneal and intratesticular γ-GluGlu injections, one-way ANOVA with Dunnett's followed by multiple comparisons was performed.

Microbiome analysis

For microbiome analysis, DNA was extracted from the colon contents using NucleoMag DNA Microbiome kit (Machery-Nagel, Germany).

Library construction for Illumina MiSeq sequencing of the 16S rRNA amplicons. Standard library preparation was performed according to Illumina (San Diego, California, United States) 16S Metagenomic Sequencing Library Preparation protocol (15044223 Rev. B). The V3 and V4 hypervariable regions of bacterial 16S rRNA gene were sequenced with Illumina MiSeq benchtop sequencer generating amplicons of ~460 by using the universal primer set: 341F-5' CCTACGGGNGGCWGCAG 3' and 785R-5' GACTACHVGGGTATCTAATCC 3' primers flanked by Illumina overhang adapter sequences (forward overhang: 5' TCGTCGGCAGCGTCAGATGTGTATAAGAGACAG 3', reverse overhang: 5' GTCTCGTGGGCTCGGAGATGTGTATAAGAGACAG 3'). After completion of the amplicon PCR with 2 x KAPA HiFi HotStart ReadyMix and dual indexing of the 96 with adaptor sequences (i7-N7xx-12 items, i5-S5xx-8 items) using the Illumina Nextera XT Index Kit (FC-131-1001/2). PCR cleanups and amplicon size selections were carried out with KAPA Pure Beads (KAPA Biosystems) based on the technical data sheet (KR1245 – v3.16) of the manufacturer resulting in final ~580–630 bp libraries. Every time, verifications were done with PCR Agilent D1000 screen tapes (5067–5582) and D1000 Reagents (5067–5583). The 16 S amplicon libraries for each sample were quantified with qPCR, normalised with respect to amplicon sizes and pooled into a single library in equal molar quantities. Finally, 5 µl of pooled 4 nM DNA library pool was prepared for sequencing on Illumina MiSeq platform. The library pool was denatured with 0.2 M NaOH and diluted to 8 pM final concentration. Sequencing was carried out with MiSeq Reagent Kit v3–618 cycle (MS-102-3003) following manufacturer's protocols (Illumina, Inc., San Diego, CA, USA).

Sequencing read preparation for downstream analysis

Paired end reads were demultiplexed by the integrated software of the Illumina MiSeq sequencing machine. The FastQ files were imported into the Qiime 2 pipeline (<https://qiime2.org/>) according to the „Atacama Soil microbiome” tutorial. Residual adapter sequences (CTGTCTCTTATACATCT) were trimmed from the 3' end of the reads with Cutadapt Software integrated into the Qiime 2 pipeline. Quality trimming was performed by using the DADA2 software⁵² and the denoising parameters were set as follows: forward read length was set to 299 bases; for the reverse reads the length was set to 249 bases. No trimming from the start of the reads was applied.

Operational taxonomic unit (OTU) generation

Multiple sequence alignment was performed with the Mafft software⁵³ and reads were taxonomically classified using Naïve Bayesian classifier trained with the Greengenes reference database (ver13_8) by selecting mapping points according to the forward-reverse primer set that was used for amplifying the 16 S V3-V4 regions of the bacterial community (341 F, 806R). Aligned sequences were clustered into operational taxonomic units (OTU) with a threshold level of 99% sequence identity. Singletons were discarded in order to reduce the likelihood of sequence artefacts interfering with further downstream analysis. The phylogenetic tree was constructed with FastTree plugin⁵⁴. Alpha diversity indices were calculated by R.

MALDI-MSI experiments

For MALDI-MSI analysis animals treated with *L. plantarum* SNI3 strain and showing obvious phenotypic changes were selected. Frozen testis samples (7 control and 7 *L. plantarum* SNI3-treated) were cut into 12 µm sections on a microtome (HM 355 S, Microm, ThermoScientific) and mounted onto indium-tin-oxide coated glass slides. The matrix solution consisted of 10 mg/ml 9-aminoacridine hydrochloride monohydrate (9-AA) (Sigma-Aldrich, Germany) in water/methanol 30:70 (v/v). SunCollect™ automatic sprayer (Sunchrom, Friedrichsdorf, Germany) was used for matrix application. The flow rates were 10, 20, 30 and 40 µL/min, respectively, for the first four layers. The other 4 layers were performed at 40 µL/min. The MALDI-MSI measurement was performed on a Bruker Solarix 7T FT-ICR-MS (Bruker Daltonik, Bremen, Germany) in negative ion mode using 100 laser shots per spot at a frequency of 1000 Hz. The MALDI-MSI data were acquired over a mass range of *m/z* 75–1000 with 50 µm lateral resolution. After MALDI-MSI measurements, acquired data underwent spectra processing in FlexImaging v. 5.0 (Bruker Daltonics, Bremen, Germany) and SCiLS Lab v. 2019 (Bruker Daltonics, Bremen, Germany). MALDI-MSI data were normalized to the root mean square of all data points.

Metabolite annotation and bioinformatics analysis

MATLAB® R2014b (v.7.10.0, Mathworks, Inc., Natick, MA) was used for pre-processing of MALDI spectra as described previously^{55,56}. Mass spectra underwent resampling, smoothing and baseline subtraction to decrease the data dimensionality and to remove noise-level peaks and artefacts. Peak picking was performed using an adapted version of the LIMPIC algorithm⁵⁷ with m/z 0.0005 minimum peak width. The signal-to-noise and intensity threshold was set to 2 and 0.01% respectively. Isotopes were automatically identified and excluded. Peaks in the mass range of m/z 75 to 1000 were resolved and annotated by accurate mass matching in Human Metabolome Database HMDB⁵⁸, and METASPACE⁵⁹. Pathway analysis was performed with the MetaboAnalyst 4.0⁶⁰ and Kyoto Encyclopedia of Genes and Genomes (KEGG) database⁶¹.

Metabolomic statistical analyses were performed using the MetaboAnalyst 4.0, which offers a variety of methods commonly used in metabolomic data analyses²⁵. Component analysis by sparse Partial Least Squares Discriminant Analysis (sPLSDA) was used for discriminant analysis with data shown on a 2D score plot with the x-axis representing component 1 and the y-axis representing component 2. The volcano plot is a combination of fold change and t-tests. The x-axis is log (FC). Y-axis is log₁₀ (p value) based on p values. The discriminative metabolites were selected by a volcano plot with fold change > 2 or < 0.5 and p-value < 0.05. Box plots were created with GraphPad PRISM v. 5.00 (GraphPad Software, Inc, La Jolla, USA). Statistical significance testing was performed using the unpaired t-test (two-tailed).

Metabolic interaction network

Metabolite correlation network was created with Cytoscape (v. 3.7.2)⁶². Nodes represent metabolites with a node size and color corresponding to the intensity log₂ fold change between control and *L. plantarum* SNI3 treatment. Edges represent functional correlations. Metabolites with significant differences between control and *L. plantarum* SNI3 treatment ($P \leq 0.05$) are shown. The network was visualized using the Compound Spring Embedder layout (Figure S3).

LC-MS/MS analysis

LC-MS/MS was used to confirm the identities of GluGlu. LC-MS/MS analysis was performed using a Sciex ExionLC AD system coupled to a Sciex ZenoTOF 7600 (Sciex, Darmstadt, Germany). Separation of metabolites was achieved on an Agilent InfinityLab Poroshell 120 HILIC-Z column (2.1 mm x 150 mm, 2.7 μm, PEEK-linked, Agilent Technologies, Waldbronn, Germany). Eluent A was 100% H₂O / 10 mM ammonium acetate + 2.5 μM InfinityLab Deactivator Additive, pH 9 and eluent B was 15% H₂O + 85% ACN / 10 mM ammonium acetate + 2.5 μM InfinityLab Deactivator Additive, pH 9. Separation was carried out at 50 °C with a flow rate of 0.25 mL/min. The exact gradient is summarized in Table S3. Detection was carried out in negative ionization mode. As chemical standards, α-GluGlu was obtained from Sigma-Aldrich and γ-GluGlu was obtained from Thermo Scientific. Both were dissolved in H₂O at a concentration of 1 mg/mL and further diluted with 5% H₂O / 95% ACN. Testis samples were homogenized in H₂O/MeOH/CHCl₃ (1/3/1, v/v/v) with 1 mL solvent per 50 mg tissue weight in a Precellys homogenizer (Bertin Technologies, Montigny-le-Bretonneux, France). After centrifugation the supernatant was evaporated and the residue dissolved in 50 μL 5% H₂O / 95% ACN. Extracted ion chromatograms for GluGlu (Empirical Formula: C₁₀H₁₆N₂O₇, m/z 275.088474 ([M-H]⁻) was constructed.

HPLC analysis

γ-Glutamyl-glutamate (γ-GluGlu) concentration in bacteria, culture media and tissue extracts were measured by high performance liquid chromatography (HPLC). Samples were homogenized by ultra-sonication in ice-cold 0.01 M per chloric acid solution, centrifuged at 3510 g for 10 min at 4°C and the pellet was saved for protein measurement according to⁶³. Perchloric anion from the supernatant was precipitated by 4 M dipotassium phosphate and removed by centrifugation. Samples were stored at -20°C until analysis. To measure γ-GluGlu concentration, the dansyl derivative formation method was used as described by⁶⁴. HPLC separation was performed by Shimadzu LC-20 AD Analytical System, using UV (Agilent 1100 VW set at 253 nm) and Fluorescence (Gilson model 121 fluorimeters, at 340 nm excitation and 450 nm emission wavelengths) detection. Solid phase extraction (SPE) was carried out on a HALO Phenyl-Hexyl (75 × 2.1 mm I.D., 5 μm) column and for separation, it was coupled to an ACE Ultra Core Super C-18 (150 × 2.1 mm I.D., 5 μm) analytical column. The flow rate of mobile phases (A: 10 mM ammonium formate, 16.8% acetonitrile, methanol 4.8%; B: 10 mM ammonium formate, 70% acetonitrile, methanol 20%, 3 pH) was 400 μL/minute in a linear gradient mode. Concentrations were calculated by a two-point calibration curve internal standard method: $(A_i * f * B) / (C * D_i * E)$ (A_i: Area of Glu-Glu component; B: Sample volume; C: Injection volume; D_i: Response factor of 1 pmol Glu-Glu standard; E: Protein content of sample; f: recovery factor of Internal Standard (IS area in calibration/IS area in actual). Data are expressed as mean ± standard error of mean at pmol/mg protein concentration. The enrichment and stripping flow rate of the buffer (10 mM ammonium formate, 1.9% acetonitrile, 1.1% methanol) was 300 μL/minute for 8 min, with total runtime of 55 min. The efficiency of the determination was calculated based on the area under the curve of the Nor-valine internal standard, which included the derivatization, SPE and separation factors; the value was $R = 88.4 \pm 9.1\%$ ($n = 25$).

Data availability

Metabolomic data have been deposited to <https://zenodo.org/records/10473905>. Video files of the behavior are found at <https://figshare.com/s/9f17be7dbbeade9098d8>. Further information, accession codes and requests for resources and reagents should be directed to and will be fulfilled by the lead c, ontact, Krisztina J. Kovács (kovacs@koki.hu). All other data reported in this paper will be shared by the lead contact upon request.

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Declarations

Competing interests

The authors declare no competing interests. The *Lactiplantibacillus plantarum* SNI3 and its use on male subjects has been filed for patent application on June 4, 2021. in Hungary. PCT procedure and national phases

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Additional information

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