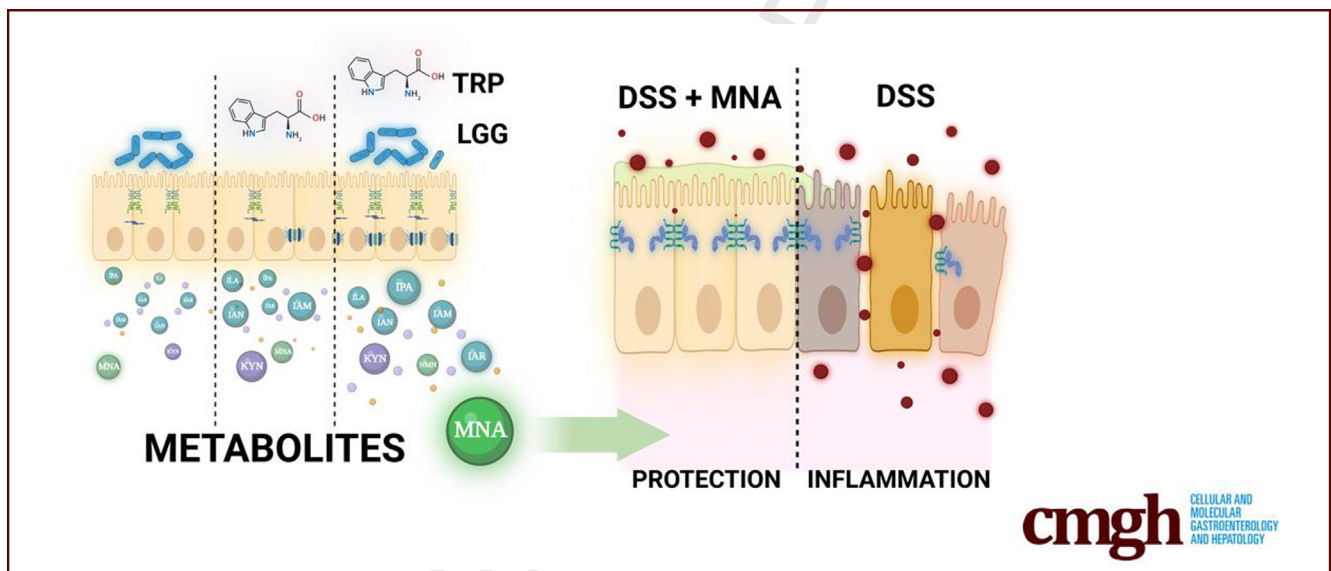


ORIGINAL RESEARCH

***Lactobacillus rhamnosus* GG Stimulates Dietary Tryptophan-Dependent Production of Barrier-Protecting Methylnicotinamide**

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**SUMMARY**

Lactobacillus (*Lactocaseibacillus*) *rhamnosus* GG synergizes with dietary tryptophan to increase vitamin B₃ metabolism in vivo. Methylnicotinamide, a vitamin B₃ degradative product, strongly promotes gut tight junction and barrier function in homeostasis and during experimental colitis.

BACKGROUND & AIMS: *Lactocaseibacillus rhamnosus* GG (LGG) is the world's most consumed probiotic but its mechanism of action on intestinal permeability and differentiation along with its interactions with an essential source of signaling metabolites, dietary tryptophan (trp), are unclear.

METHODS: Untargeted metabolomic and transcriptomic analyses were performed in LGG monocolonized germ-free mice fed trp-free or -sufficient diets. LGG-derived metabolites were profiled in vitro under anaerobic and aerobic conditions. Multiomic correlations using a newly developed algorithm

discovered novel metabolites tightly linked to tight junction and cell differentiation genes whose abundances were regulated by LGG and dietary trp. Barrier-modulation by these metabolites were functionally tested in Caco2 cells, mouse enteroids, and dextran sulfate sodium experimental colitis. The contribution of these metabolites to barrier protection is delineated at specific tight junction proteins and enterocyte-promoting factors with gain and loss of function approaches.

RESULTS: LGG, strictly with dietary trp, promotes the enterocyte program and expression of tight junction genes, particularly *Ocln*. Functional evaluations of fecal and serum metabolites synergistically stimulated by LGG and trp revealed a novel vitamin B₃ metabolism pathway, with methyl-nicotinamide (MNA) unexpectedly being the most robust barrier-protective metabolite in vitro and in vivo. Reduced serum MNA is significantly associated with increased disease activity in patients with inflammatory bowel disease. Exogenous MNA enhances gut barrier in homeostasis and robustly promotes colonic healing in dextran sulfate sodium colitis. MNA

is sufficient to promote intestinal epithelial *Ocln* and RNF43, a master inhibitor of Wnt. Blocking trp or vitamin B₃ absorption abolishes barrier recovery in vivo.

CONCLUSIONS: Our study uncovers a novel LGG-regulated dietary trp-dependent production of MNA that protects the gut barrier against colitis. (*Cell Mol Gastroenterol Hepatol* 2024;■:■-■; <https://doi.org/10.1016/j.jcmgh.2024.04.003>)

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Unlike tight epithelia, the permeability of the small intestine is primarily defined by the paracellular pathway between epithelial cells lining the lumen.¹ This pathway is selectively sealed by tight junctions (TJ) exhibiting barrier properties that can be altered by diet, the gut microbiota and their metabolites, and by host response to these luminal signals. Two distinct routes of small intestinal paracellular flux have been proposed: the “leak” and “pore” pathways mediating the permeability, respectively, of such macromolecules as dextran and of ions and small solutes.² Both routes are regulated mainly by TJ proteins occludin (*Ocln*), ZO-1 (*Tjp1*), and the large family of claudins (*Cldns*).³⁻⁵ Intestinal expression and intracellular location of *Ocln* and claudins, both of which constitute intercellular TJ bridges, and of ZO1, which link these bridges to the cytoskeleton, are altered markedly in patients with gut permeability disorders.^{6,7} Abnormal perturbations in the composition of the gut microbiota, termed gut dysbiosis, can disrupt homeostatic microbiota-host interactions, thereby impacting the expression, integrity, and location of these TJ proteins and, as a consequence, causing inappropriate increases in permeability of the paracellular pathway.⁸ This leaky gut condition has been associated with inflammatory bowel disease (IBD) and other autoimmune disorders.^{5,9-11} Thus, patients with IBD display an increased paracellular permeability with TJ abnormalities, whereas an impaired intestinal barrier precedes and predicts IBD diagnosis by several years.^{12,13}

The harmful association between leaky gut syndrome and IBD is exacerbated by a deficiency in dietary tryptophan (trp, an essential amino acid).^{11,14} Serum levels of trp are much lower in patients with IBD compared with healthy control subjects,¹¹ reinforcing earlier findings in colitis animal models showing dietary trp levels to be inversely proportional to the magnitude of intestinal inflammation and permeability.^{15,16} Only 1% of dietary trp is synthesized into serotonin, and most are catabolized in the gut via 2 major pathways: kynurenine and indole. First, in both host and bacteria, the kynurenine pathway synthesizes precursors of vitamin B₃ nicotinamide (NAM), and thus, also of NAD⁺.¹⁷ Like trp in IBD serum, NAD⁺ levels in ileal and colonic tissues of patients with IBD are markedly reduced, indicating a pathologic dysregulation in NAM metabolism.^{18,19} Second, the gut microbiota, particularly commensal lactobacilli, convert dietary trp into a variety of indoles, which in turn become ligands of the host Aryl Hydrocarbon Receptor found in barrier organ systems, such as

the gastrointestinal tract. A common indole, indole-propionic acid, is reduced in the stool of patients with ulcerative colitis (UC).²⁰

Lactacaseibacillus (formerly *Lactobacillus*) *rhamnosus* GG (LGG), a widely consumed probiotic strain that is the subject of 210 clinical trials,²¹ displays promising efficacy in addressing gastrointestinal disorders ranging from diarrhea and necrotizing colitis to autoimmune conditions associated with leaky gut syndrome.²²⁻²⁶ Despite these findings, conflicting results in trials with patients with irritable bowel syndrome and patients with IBD underscore the complex influence of disease heterogeneity and patient nutrition on LGG efficacy.^{27,28} Although we recently reported LGG profoundly changing the host's intestinal luminal metabolome while excluding gut colonization of pathobiont bacteria, the identity and health impact of LGG-dependent metabolites remain poorly characterized, emphasizing the need for an understanding of the underlying mechanisms and signaling molecules mediating LGG's barrier enhancement.²⁹

Here, we obtained comprehensive, untargeted transcriptomic and metabolomic profiles of the ileum and of both feces and serum, respectively, in LGG monoassociated germ-free (GF) mice fed trp-sufficient or trp-free diets. We also characterized LGG-derived metabolites under aerobic and anaerobic culture conditions. Through a multiomic correlation analysis newly developed by us,³⁰ we initially uncovered LGG- and dietary trp-associated metabolites that statistically linked robustly to transcripts belonging to pathways modulating enterocyte TJs and differentiation. We then subsequently showed via in vitro, ex vivo, and in vivo functional experiments that most of the correlated metabolites can actually profoundly benefit the gut barrier. Surprisingly, LGG specifically promotes an intestinal trp-to-NAM metabolic pathway by elevating its key enzymes and transporters. Moreover, we also discovered that methyl-nicotinamide (MNA), a vitamin B₃ metabolite thought to be mainly destined for urinary excretion and thus metabolically inert, actually exhibits strong protection of barrier function in vitro and in vivo. In fact, we also uncovered via in silico analysis that decreased serum MNA is associated with increased disease activity in patients with IBD. Thus, LGG stimulates a dietary trp-dependent vitamin B₃ synthesis pathway with MNA being the most barrier-protecting and anticarcinogenic metabolite.

Abbreviations used in this paper: CD, Crohn's disease; DSS, dextran sodium sulfate; FITC, fluorescein isothiocyanate; GF, germ free; IBD, inflammatory bowel disease; ISO, isoniazid; LGG, *Lactobacillus* (*Lactacaseibacillus*) *rhamnosus* GG; LGGtrp-, GF mice monocolonized with LGG and fed trp-free diets; LGGtrp+, GF mice monocolonized with LGG and fed trp-sufficient diets; LPS, lipopolysaccharide; METRCA, metabolome-transcriptome correlation analysis; MNA, methyl-nicotinamide; NAM, nicotinamide; PBS, phosphate-buffered saline; PBStrp-, GF mice gavaged with PBS and fed trp-free diets; PBStrp+, GF mice gavaged with PBS and fed trp-sufficient diets; qPCR, quantitative polymerase chain reaction; TEER, transepithelial electrical resistance; TJ, tight junction; trp, tryptophan; UC, ulcerative colitis.

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Results

LGG and Dietary Tryptophan Synergize to Promote Enterocyte Program

GF mice fed with trp+ and trp- showed a modest weight gain or loss, respectively. Food consumption was slightly greater in trp- mice. Equivalent LGG colonization in trp+ and trp- mice was found by quantitative polymerase chain reaction (qPCR) of fecal DNA using 16S rRNA and LGG-specific primers (Figure 1B and C). Three weeks after inoculation, bulk RNA-sequencing was performed on ilea of GF mice gavaged with phosphate-buffered saline (PBS) and fed trp-free diets (PBS trp-), GF mice gavaged with PBS and fed trp-sufficient diets (PBS trp+), LGG trp-, and LGG trp+ mice (n = 5). Dietary trp alone altered ileal transcriptome in GF mice (Figure 1D). LGG association significantly altered ileal transcriptome under both trp+ and trp- conditions. LGG trp+ transcriptome was noticeably different from the other 3 groups suggesting that LGG and dietary trp drove the largest change in ileal transcriptome.

Dietary trp affected 3917 ileal transcripts in GF mice, and 5315 transcripts in LGG-associated mice (Figure 1E), with 1496 transcripts affected solely by dietary trp. LGG affected 3088 ileal transcripts in trp- mice and 4730 transcripts in trp+ mice (Figure 1F), with 918 transcripts affected solely by LGG. The synergistic effect of LGG and dietary trp was reflected by the number of altered genes and the magnitude of fold changes (Figure 1G and H). These results suggested that LGG and dietary trp robustly changed ileal transcriptome, and the effect was greater than those elicited by dietary trp or LGG alone.

Gene set enrichment analysis revealed that LGG and dietary trp increased transcriptomic programs of enterocyte differentiation and function, including TJ genes, brush border, fatty acid β -oxidation, and apoptosis being impacted the most (Figure 1I-K). Heatmap illustrated a robust elevation of enterocyte genes in LGG trp+ mice, and such elevation strictly depended on dietary trp (Figure 1L). This synergism between LGG and trp promoting the TJ and brush border, respectively, is best exemplified by their genes *Ocln* and *Slc5a1*, whose expressions are greatest in LGG trp+ (Figure 1M and N).

The effects on enterocyte program seemed unique to LGG, because a comparison of ileal transcriptomes of *Ruminococcus gnavus*-monocolonized and trp-fed GF or specific pathogen-free mice showed that the increased enterocyte genes were predominantly in LGG mice (Figure 2A). The elevated enterocyte program in LGG trp+ seemed to be at the cost of secretory cells (Figure 2B), because a partial goblet cell transcriptome (eg, *Tff3*, *Agr2*) (Figure 2C) and almost the entire Paneth cell transcriptome (eg, *Lyz1*, numerous defensins) (Figure 2D) were reduced in LGG trp+ mice. In contrast, LGG plus dietary trp had no effect on *Lgr5* and *Olfm4*, marker genes of the fast-cycling intestinal stem cells (Figure 2E), or epithelial and stromal Wnt ligand genes (Figure 2F). Importantly, LGG and dietary trp seemed to increase *Rnf43*, *Dll1*, and *Dll4*, regulators of the Wnt and Notch signaling, respectively (Figure 2G). Confocal immunostaining analysis validated a reduced Paneth cell number in LGG trp+ ileum (Figure 2H).

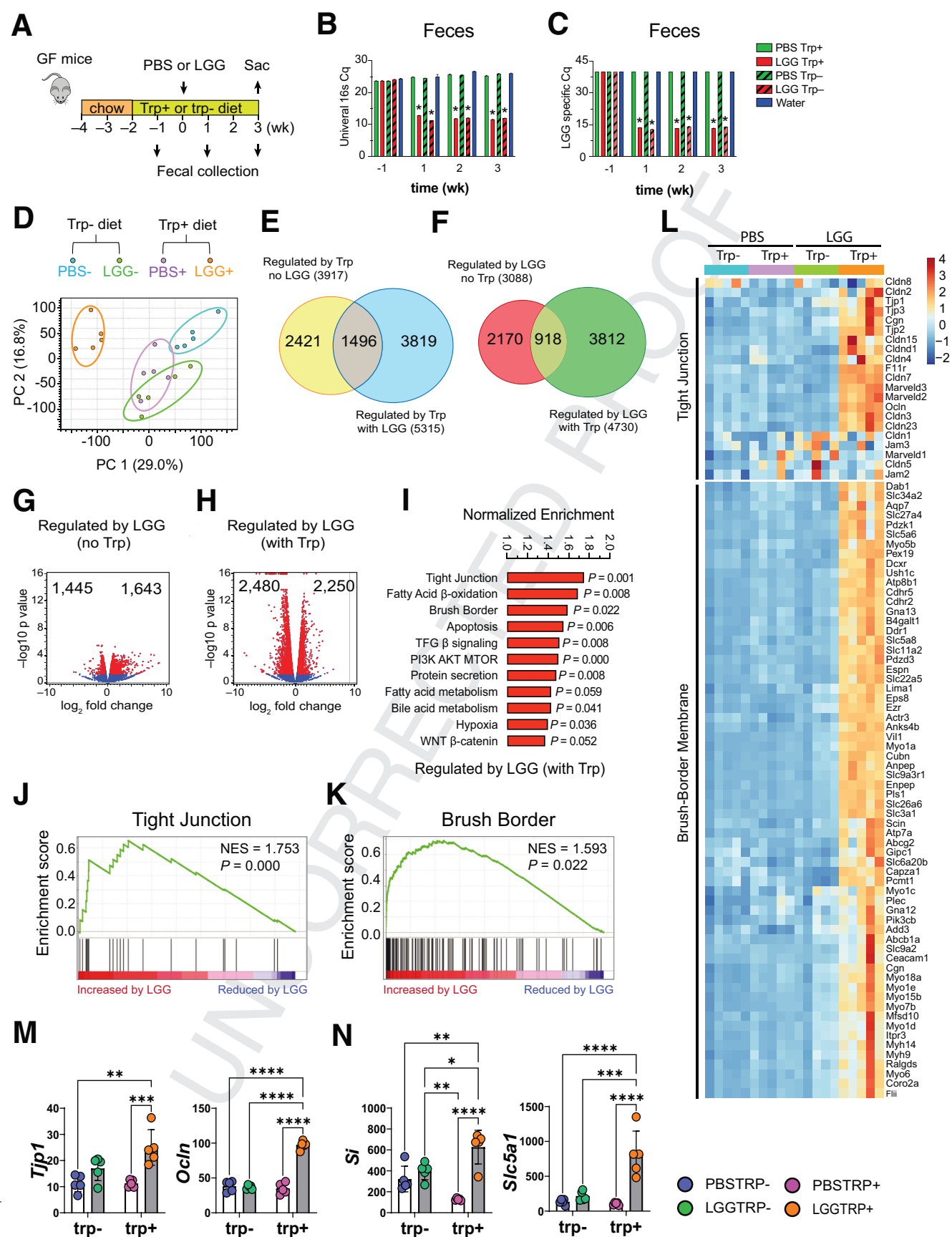
LGG colonization in mice consuming trp+ or trp- diets trigger complicated systemic responses to diet-LGG-host interaction. To test if live LGG perfused through the intestinal tract in vivo may acutely elicit a similar intestinal transcriptomic response, we performed intraluminal perfusion using saline or live LGG for 4 hours (Figure 2J). Bulk RNA-Seq on LGG- or saline-perfused ileum showed separated transcriptomic profiles (Figure 2J), with the most reduced transcripts being *defensins* in LGG-perfused mice (Figure 2K and L). We did not observe changes in enterocyte genes, suggesting that LGG cannot acutely promote enterocyte program within the short time window studied in this perfusion experiment.

LGG Drives Specific Fecal and Serum Metabolome In Vivo

We postulate that LGG may alter the host metabolome, which in turn may regulate intestinal epithelial programming. We performed an untargeted fecal metabolomic analysis using liquid chromatography-mass spectrometry and uncovered approximately 200 polar fecal metabolites that differed in abundance among 4 groups (Figure 3A). In GF mice, dietary trp before colonization markedly separated the host fecal metabolome profile (Figure 3B). Within a week of LGG colonization, fecal metabolite profiles changed (Figure 3B), and the separation persisted after 3 weeks of colonization (Figure 3B). Similar changes were observed for metabolites in the positive mode.

Serum metabolomic profiles were modestly separated with a noticeable overlap between LGG trp- and PBS trp- mice (Figure 3C). In the presence of dietary trp, LGG induced a marked change in serum metabolome, suggesting that LGG impacts the host serum metabolites only in the presence of dietary trp. In contrast, the liver metabolome was only affected by dietary trp, with little impact from LGG (Figure 3D). Cross-comparing the fecal, serum, and liver metabolites suggested that the metabolites modulated by LGG were compartment-specific (Figure 3E), suggesting that LGG exerts a delicate modulation of the host leading to specific fecal and serum metabolomic profiles.

Variables important in the projection analysis revealed the identities of the most significant fecal (Figure 3F and G) or serum (Figure 3H and I) metabolites that were increased or decreased by LGG under trp- (Figure 3F and H) or trp+ (Figure 3G and I) conditions, respectively. Dietary trp can be metabolized in host cells into kynurenine and NAM or converted by gut bacteria into various indoles (Figure 3J). We then specifically examined indole pathway and kynurenine pathway metabolites to identify those showing a synergistic response to LGG and dietary trp. Dietary trp elevated multiple serum indoles and kynurenine, with serum indole-3-acrylic acid showing a synergistic response to LGG and trp (Figure 3K and L). Interestingly, serum MNA, a downstream degradation product of kynurenine-to-NAM pathway (Figure 3J), was also significantly elevated primarily in LGG trp+ mice (Figure 3L). Fecal indole lactic acid was increased by LGG, independent of dietary trp, whereas indole-3-acetamide increased in LGG trp+ mice (Figure 3M).



Fecal NAM riboside and MNA were both increased in LGG trp+ mice (Figure 3N). Again, liver indoles and kynurenine were only elevated by dietary trp with limited influence from LGG (Figure 3O and P).

Identification of LGG-Regulated Barrier-Promoting Metabolites

We developed a high-throughput metabolome-transcriptome correlation analysis (METRCA), which identified significant correlations between the 2 omics datasets.³⁰ Comparing LGG trp- and PBS trp- mice, METRCA uncovered 28 LGG-regulated metabolites in fecal, serum, and liver that each correlated with relatively few specific ileal transcripts (Figure 4A). In trp+ mice, METRCA uncovered a marked increase in LGG-regulated metabolites that significantly correlated with numerous ileal transcripts (Figure 4B). Several indoles, among other metabolites, were identified when comparing PBS trp+ and LGG trp+ mice (Figure 4B). Interestingly, both fecal and serum indole-3-acetamide correlated with similar sets of representative TJ, brush border, and lipid metabolism genes (Figure 4C). However, fecal and serum indolelactic acid not only correlated with distinct ileal transcripts (Figure 4D) but also with different numbers of genes. Various trp and non-trp metabolites, although positively correlating with enterocyte gene networks, exhibited negative correlations with goblet or Paneth cell genes (Figure 4C-F).

We next conducted a targeted query for metabolites that were correlated with TJ genes. In trp- mice, few LGG-regulated metabolites were correlated and those few were mostly linked with a small number of TJ genes (Figure 4G). In trp+ mice, however, we uncovered a greater number of trp or non-trp metabolites correlating with TJ genes (Figure 4G). Metabolites positively or negatively correlated with *Ocln* (Figure 4H) or *Tjp1* (Figure 4I) were revealed. Several metabolites were found to be correlated with multiple TJ genes, with fecal indole-3-acetamide, serum indole-3-propionic acid, and serum MNA being the most highly ranked positive correlators (Figure 4H-J). These correlations were validated by representative TJ-correlating plots for trp and non-trp derivatives (Figure 4J-L). Because there are

sealing claudins that reduce and leaky claudins that enhance paracellular permeability, it is interesting to note that numerous LGG metabolites positively correlated with sealing claudin 3 exhibits either no correlation (eg, fecal NAM riboside, fecal indole-3-acetamide) or negative correlation (eg, fecal salicylamide, fecal sorbitol) with leaky claudin 2 (not shown). Simultaneously, LGG metabolites negatively correlated with claudin 3 (eg, fecal acetyl-glutamine, fecal acetyl-glutamate) demonstrate a positive regulation with claudin 2. Most LGG serum metabolites, including numerous indoles positively correlated with claudin 3, do not correlate with claudin 2.

To functionally test if the previously mentioned TJ-correlating fecal and serum metabolites may influence barrier function, we used the polarized Caco-2 monolayers for transepithelial electrical resistance (TEER) and fluorescein isothiocyanate (FITC)-dextran permeability assays. The addition of 2.5%–5% of LGG supernatant on Caco-2 monolayer resulted in a 2-fold increase in TEER ($P = .01$) compared with the control (Figure 5A). This enhancement exceeded the efficacy of p40, an LGG-derived peptide, suggesting additional barrier-promoting factors in LGG spent medium. We thus used this system to test highly ranked barrier-correlating LGG-regulated metabolites, by applying them to either the luminal or the basolateral sides of the monolayer. Luminal administration of indole-3-acetonitrile, indole-3-acetic acid, and indole-3-carboxylic acid improved TEER by 168%, 91%, and 39%, respectively, after 48 hours of incubation compared with vehicle (Figure 5C and D). Treating cells with a cell free *Clostridium difficile* supernatant provoked a 46% reduction in TEER, consistent with an increased permeability of the paracellular pathway (Figure 5B). Under Crohn's disease (CD)-treated condition, the luminal application of indoles (indole-3-lactic acid, indole-3-propionic acid, indole-3-acetonitrile, indole-3-acetamide, indole-3-acetic acid, and indole-3-carboxylic acid) restored TEER with efficacies ranging from 29% to 96% (Figure 5B-D). Moreover, basolateral treatment of indole-3-acetamide and indole-3-carboxyaldehyde exhibited a remarkable increase in baseline TEER, with 1.3- and 1.6-fold enhancements, respectively, in comparison with the vehicle. Under CD treatment, the basolateral indole-3-lactic

Figure 1. (See previous page). LGG and dietary trp promote enterocyte transcriptome. (A) 2 x 2 experimental design: GF (gavaged with PBS) and LGG-monoinoculated mice (LGG) fed a trp-sufficient (trp+) or trp-free (trp-) diet for 3 weeks after inoculation, then sacrificed (Sac). (B) Cq number of RT-PCR analysis using universal 16S primers of fecal samples collected during preinoculation (-1), and at 1-, 2-, and 3-weeks postinoculation. (C) Cq number of RT-PCR using LGG-specific primers at the same time points. (D) Principal component analysis (PCA) of ileal transcriptome from mice fed a trp- diet and gavaged with PBS (PBS-, blue), fed trp+, PBS-gavaged (PBS+, purple), fed trp-, LGG-monocolonized (LGG-, green), and fed trp+, LGG-monocolonized (LGG+, orange). (E) Venn diagram of numbers of ileal transcripts (FC > 1.5, FDR < 0.05) representing trp effect without (PBS+ vs PBS-) and with LGG (LGG+ vs LGG-). (F) Venn diagram of numbers of ileal transcripts (FC > 1.5, FDR < 0.05) representing trp effect without (PBS+ vs PBS-) and with LGG (LGG+ vs LGG-). (G) Volcano plot of genes upregulated and downregulated by LGG without trp, and (H) with trp. (I) Normalized enrichment score following gene set enrichment analysis comparing transcriptomes of trp-sufficient mice with LGG (LGG+) and with trp. Leading edge graphs depicting nonrandom distribution of genes in (J) tight junction and (K) brush border pathways from LGG+ vs PBS+ mice. (L) Heatmap of ileal transcripts from PBS-, PBS+, LGG-, and LGG+ ($n = 5$ each group), showing only significantly different genes (FDR < 0.05). RPKM of representative transcripts of genes in the (M) tight junction and (N) brush border membrane. White bars, PBS; gray, LGG. Statistical significance among the groups was determined by 2-way analysis of variance, * $P < .05$, ** $P < .01$, *** $P < .001$, **** $P < .0001$. *Ocln*, occludin; RPKM, reads per kilobase of transcript, per million mapped reads; Si, sucrase-isomaltase; Slc5a1, Sodium-dependent glucose transporter 1; Tjp1, Tight junction protein 1.

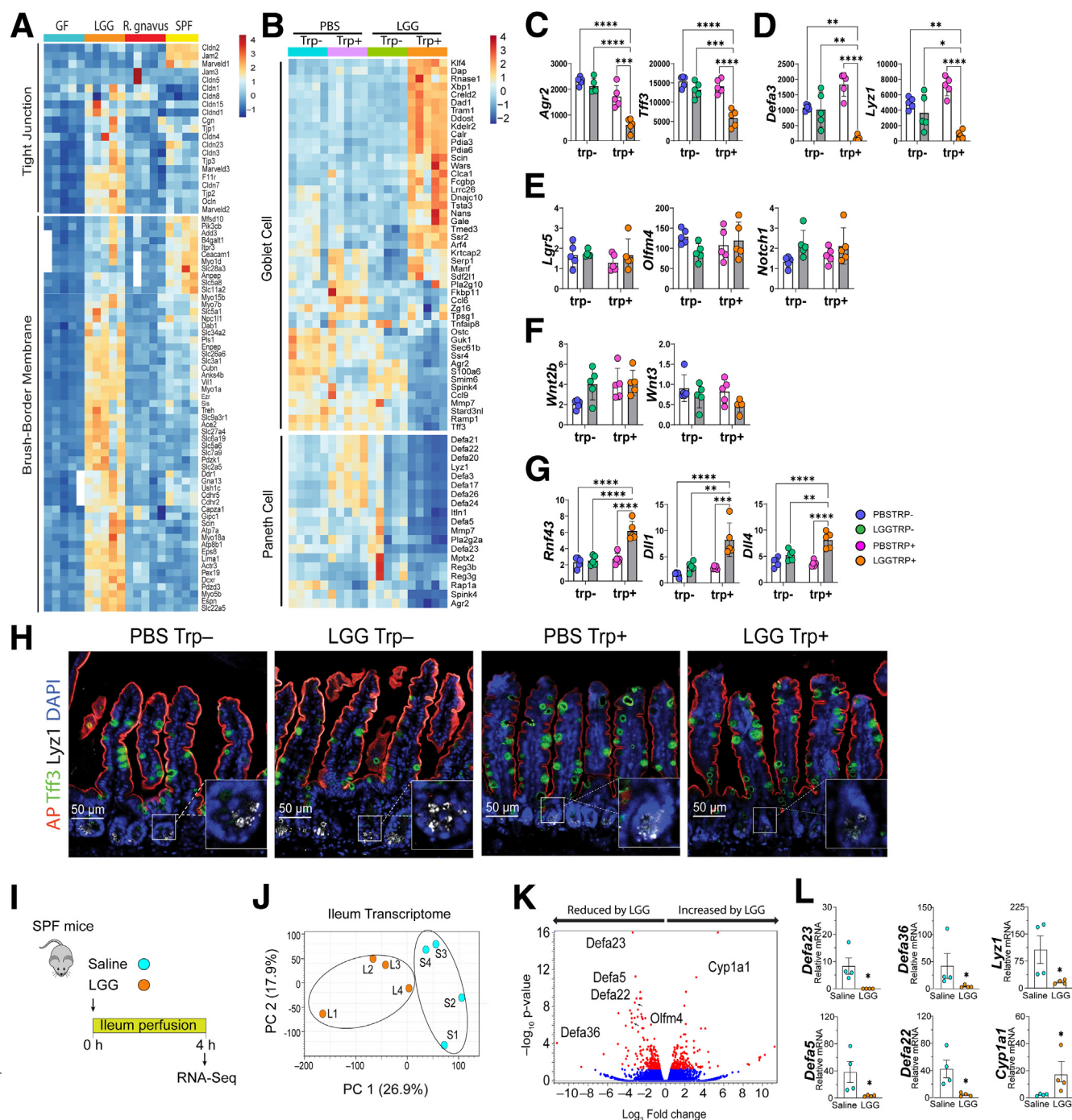


Figure 2. LGG and dietary trp effects are specific and suppress Paneth cell transcriptome. (A) Representative heatmaps of ileal TJ and brush-border transcripts in GF (blue bar on top of heat map), LGG-monocolonized (orange), *Ruminococcus gnavus*-monocolonized (red), and specific pathogen free (SPF) (yellow) mice (n = 4–5 each group) suggesting LGG effects are specific. (B) Targeted, representative partial heatmaps of ileal Goblet and Paneth cell transcripts were significantly different (FDR < 0.05) among PBS- (blue), PBS+ (purple), LGG- (green), and LGG+ (orange) mice (n = 5). (C–G) Representative transcripts of goblet cells, Paneth cells, stem cells, Wnt and Notch regulator genes. (H) Immunostaining against Trefoil factor 3 (TFF3, green), alkaline phosphatase (AP, red), Lysozyme 1 (LYZ1, white), DAPI (blue). (I) Conventional mouse intestine was perfused with saline (Ringer) or LGG. (J) Principal component analysis (PCA) showing separation of saline- (blue) and LGG-perfused (orange) ileal transcriptomes (n = 4). (K) Volcano plot of ileal transcriptome perfused with or without LGG. Significantly altered expression is shown in red (|FC| > 1.5, FDR < 0.05). (L) Representative *Defa* transcripts. Statistical significance among the groups was determined by 1-way analysis of variance, *P < .05, **P < .01, ***P < .001, ****P < .0001.

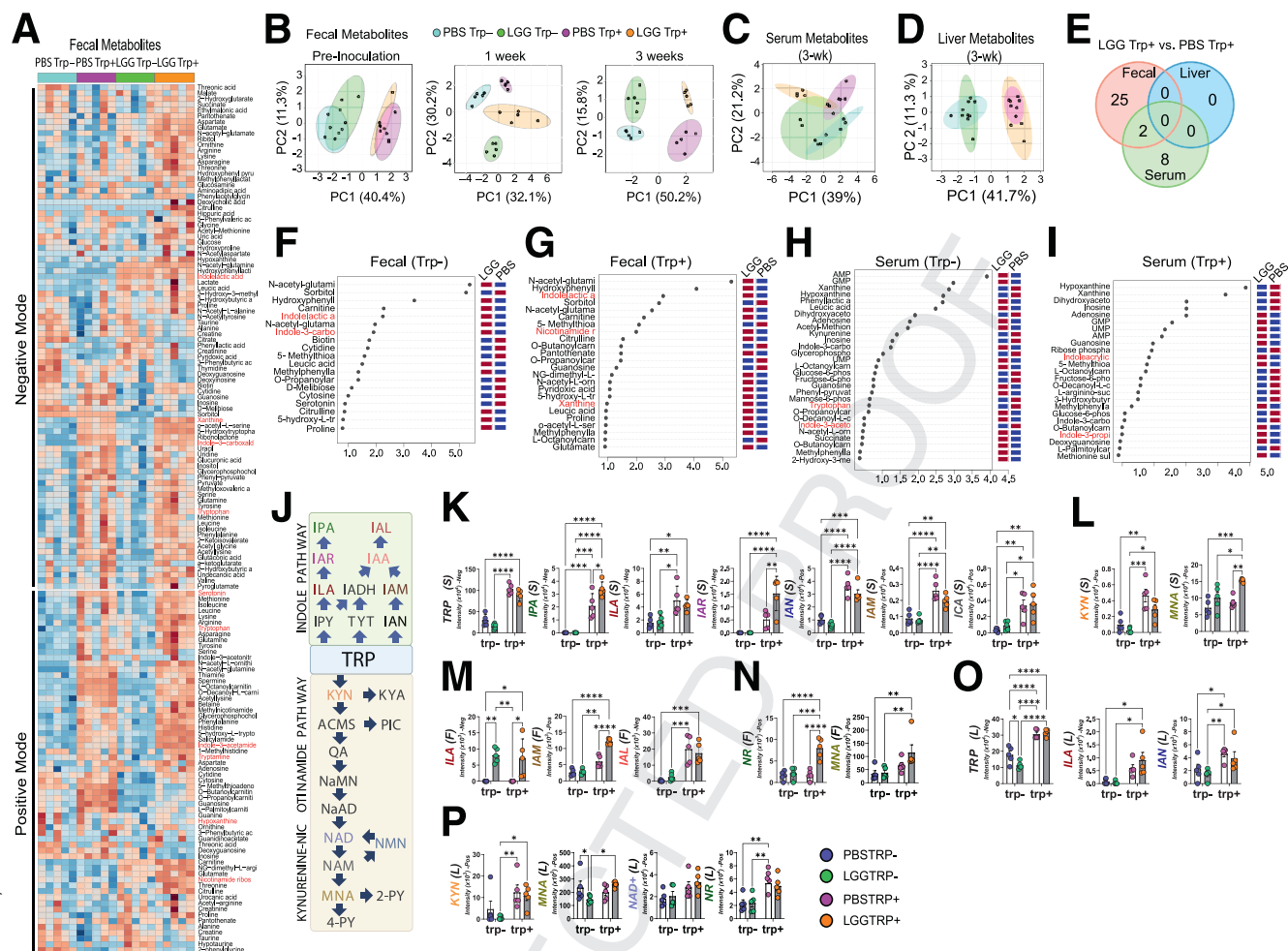
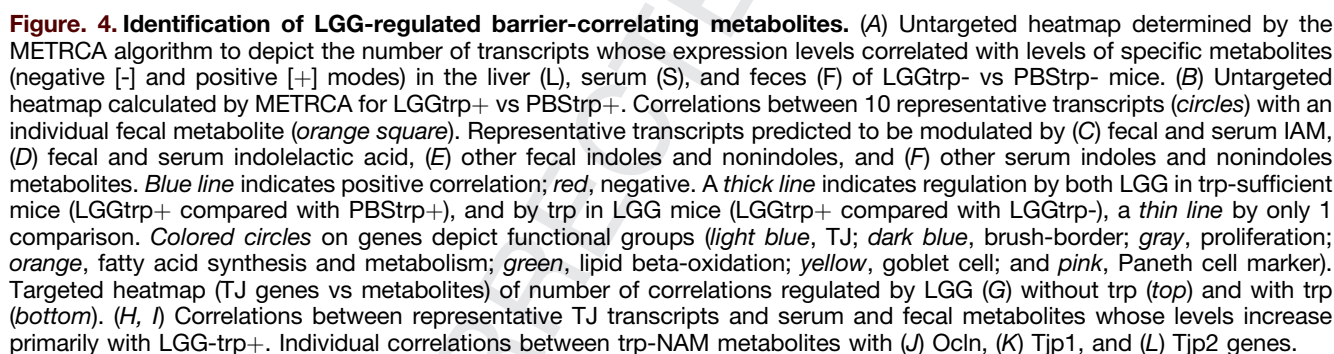


Figure 3. LGG and trp drive indole and kynurenine (KYN)-NAM metabolomic pathways. (A) Heatmap of fecal metabolites analyzed by liquid chromatography–mass spectrometry in negative (*top*) and positive (*bottom*) modes. Significant LGG- and trp-induced changes were observed in 121 fecal metabolites (88 negative, 62 positive, 29 in both). Serum had 106 (negative) and 69 (positive) metabolites, whereas the liver had 104 (negative) and 75 (positive). Darker brown indicates upregulation, blue indicates downregulation. (B) Principal component analysis (PCA) of fecal metabolites (negative mode) over time: 1 week before (*left*), 1 week (*middle*), and 3 weeks (*right*) after LGG inoculation (*n* = 5). PCA of (C) serum and (D) liver metabolites 3 weeks after LGG inoculation. (E) Venn diagram depicting the number of fecal (red), serum (green), and liver (blue) metabolites (negative mode) significantly different between LGG+ vs PBS+ mice ($|FC| > 1.5$, $FDR < 0.05$). Twenty-seven fecal metabolites differed between LGG+ and PBS+ mice, 2 also in serum. (F) Variables important in the projection (VIP) scores of fecal metabolites driving intergroup differences between LGG and GF mice fed trp-sufficient diets (LGG+ vs PBS+). (H) VIP scores of serum metabolites between LGG- and PBS- and between (I) LGG+ vs PBS+. (J) Diagram showing the indole and kynurenine-nicotinamide pathways. Levels of indoles and kynurenine-NAM metabolites in the (K, L) serum, (M, N) fecal, and (O, P) liver. Statistical significance among the groups was determined by 2-way analysis of variance, * $P < .05$, ** $P < .01$, *** $P < .001$, **** $P < .0001$. IAL, indole-3-carboxyaldehyde; IAM, indole-3-acetamide; IAN, indole-3-acetonitrile; IAR, indole-3-acrylic acid; ILA, indole-3-lactic acid; IPA, indole-3-propionic acid; KYN, kynurenine; NAD⁺, nicotinamide adenine dinucleotide; NR, nicotinamide riboside.

acid, indole-3-acetamide, and indole-3-carboxyaldehyde restored TEER by 57.5%–72.4% (Figure 5F and G). FITC-dextran permeability assays were largely consistent with TEER results (Figure 5E and H).

We then evaluated candidate metabolites on enteroids from specific pathogen free mice. Following exposure to lipopolysaccharide (LPS), epithelial permeability increased by 1.75-fold quantified as FITC-dextran intensity within the enteroid. Indole-3-propionic acid, indole-3-acetamide, MNA, and carnosine attenuated LPS induced permeability

(Figure 5I and J). Furthermore, we found by immunofluorescent staining and RT-qPCR, indole-3-propionic acid, MNA, indole-3-acetamide, and carnosine significantly increased Tjp1 and Occludin expression compared with the vehicle and LPS group (Figure 5K–M). To test if the barrier-promoting effects of the metabolites may rely on TJ function, we did the experiments with Occludin^{KO} enteroids, which exhibited a 320% increase in permeability compared with the wild-type enteroids. LPS did not exacerbate the permeability, nor did the metabolites rescue the

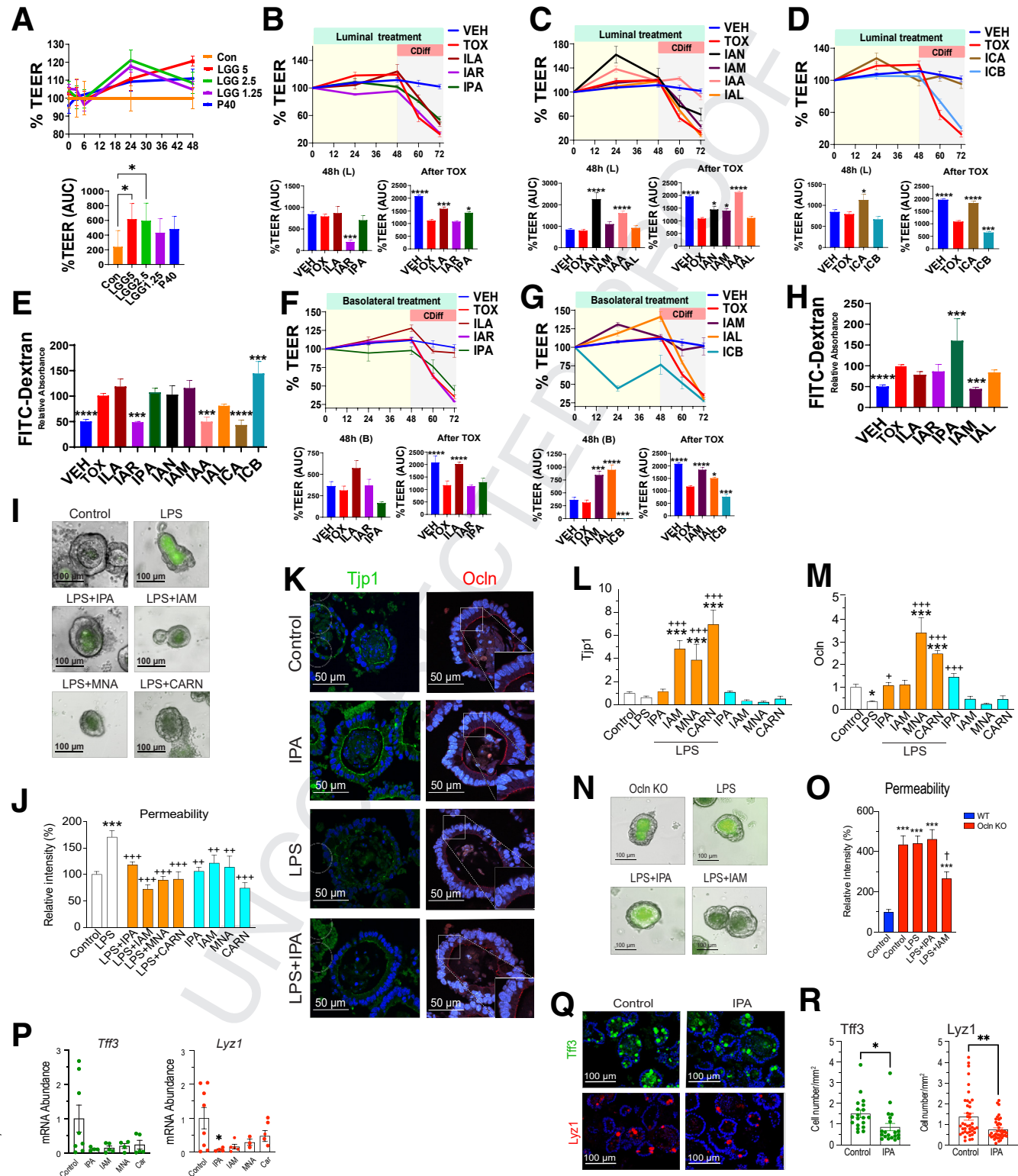


LGG Stimulates TRP-NAM Pathway and MNA Promotes Gut Barrier

NAD catabolism involves at least 6 enzyme families, including sirtuins, CD38 and poly(ADP-ribose) polymerases whose by-product is NAM, which is either recycled back to NAD or methylated into MNA that is, in turn, oxidized into the final excretory products N-methyl-2-pyridone-5-carboxamide (2-PY) and N-methyl-4-pyridone-3-carboxamide (4-PY) (Figure 6A). Targeted transcriptomic analysis revealed NAM metabolism pathway upregulation in the ileum but not in liver of LGG trp+ mice (Figure 6B). We also observed increased trp metabolism gene network in LGG trp+ ileum but not liver (Figure 6C). Specifically, most enzymes and transporters of the trp-NAM pathway were significantly increased (Figure 6B and C). To determine if LGG directly makes trp-NAM metabolites, liquid chromatography-mass spectrometry metabolomics performed on overnight cultured LGG in aerobic or anaerobic conditions, revealed that kynurenine and NAD^+ were synthesized (Figure 6D). Nicotinate and MNA decreased in culture, suggesting that the augmented serum MNA in LGG

trp+ mice reflect a result of LGG-stimulated trp to NAM metabolism. Despite the impermeable nature of NAD⁺, the significantly increased ectoenzymes, *Cd38*, *Nt5e* (*Cd73*), *Bst1* (*Cd157*), and various transporters in the LGG trp+

mice (Figure 6A and B) support an enhanced influx of extracellular NAM precursors that were taken into the NAD⁺-NAM-MNA intracellular metabolic pathways (Figure 6A).



Within the integrative analysis of 1300 serum metabolites in 484 patients with UC, 464 patients with CD, and 365 controls subject,³¹ we searched for trp-NAM metabolites in stool and serum samples of patients with IBD, including CD and UC. Significantly lower levels of certain indoles were detected in the serum of patients with IBD compared with healthy control subjects (Figure 6E). Examining the relationship of metabolites with disease indices highlighted the association of low serum MNA and xanthenurate levels with increased disease severity in UC and CD, whereas high fecal kynurenine is linked with the severity of CD (Figure 6F). MNA is the strongest negative correlator with the Mayo endoscopic score for UC (q-value, 5.08E-6) (Figure 6F). In addition, indole acetotylcarnitine consistently displayed significantly lower levels in IBD, whereas indoleacetylglutamine was significantly lower in UC and IBD (Figure 6E). Indole acetic acid derivatives, such as indole-7-acetic acid and methyl indole-3-acetate, exhibited reduced levels in patients with UC and patients with IBD. These findings emphasize that dysregulation in trp-NAM metabolism may play a contributory role in both the onset and progression of IBD.

We then assessed by TEER and dextran permeability all kynurenine-NAM-related metabolites for their effects on the gut barrier. Luminal administration of individual metabolites for 48 hours did not induce significant changes in baseline TEER (Figure 6G and H). However, in the presence of a barrier disruptor, *C difficile* spent medium, NAM riboside, NAD⁺, NAM, and MNA ameliorated the disrupted TEER by 25%–60% (Figure 6J). Notably, the marked increase in dextran permeability caused by *C difficile* was effectively mitigated by luminal kynurenine, NAM riboside, NAD⁺, NAM, and MNA by 30%–50% (Figure 6J). Before *C difficile*, basolateral application of NAM mononucleotide and NAM increased baseline TEER modestly after 48 hours (Figure 6K and L). In the presence of *C difficile*, basolateral kynurenine, NAM mononucleotide, NAM, NAD⁺, and MNA rescued the TEER by 18%–42% (Figure 6K and M), whereas basolateral kynurenine and MNA prevented marked increases in dextran permeability (Figure 6N). These findings highlight the contribution of trp-NAM metabolic products to

enhancing and protecting the gut barrier, with MNA unexpectedly being the most robust candidate.

MNA Protects Barrier Function and Promotes Colonic Healing During Colitis

With the compelling in vitro observation of MNA efficacy in barrier enhancement and protection, we next investigated MNA's effect in vivo. Exogenous MNA, when administered intraperitoneally to specific pathogen-free mice every other day for 2 weeks, significantly increased by 2-fold barrier function as assessed by ovalbumin flux from lumen to plasma, an assay that estimates permeability of the gut paracellular pathway (Figure 7A and B). We then tested MNA effects in 4 groups of mice that were treated with PBS, MNA, PBS+ dextran sodium sulfate (DSS), and MNA-DSS (Figure 7C). Although no significant changes in body weight were observed in the noncolitis groups, that of the DSS-treated group declined markedly after 8 days. Remarkably, during the recovery phase, the MNA-treated but not the PBS-treated DSS mice exhibited a robust and rapid recovery, reaching 100% of initial body weight within 4 days, suggesting a remarkable efficacy of MNA in promoting colonic healing. This finding is supported by histologic analysis indicating a substantial amelioration of colonic inflammation and tissue damage in MNA-treated DSS mice (Figure 7D and E).

To investigate the protective mechanisms underlying MNA effects, we determined Ocln expression. At steady state, MNA treatment alone led to a 2-fold increase in ileal and colon Ocln levels (Figure 7F-I). DSS treatment markedly reduced Ocln levels, and MNA but not PBS injection rescued significantly Ocln expression (Figure 7D-G). Notably, MNA administration not only rescued colon Ocln levels from the impact of DSS but also maintained them at levels comparable with those of the PBS group (Figure 7F-I). These MNA-mediated effects on Ocln were validated by Western blot analysis (Figure 7J and K).

Moreover, MNA treatment reduced fecal lipocalin levels compared with those of PBS-treated DSS mice, further supporting observations that MNA affords mucosal

Figure 5. (See previous page). LGG-regulated TRP-NAM metabolites promote and protect the gut barrier. (A) Top shows luminal treatment of Caco2 cells with LGG cell-free supernatant at different concentrations (%v/v) or with P40 (50 ng/mL) over 48 hours (n = 6 per group) Control (con), LGG medium or PBS. % TEER was normalized to that of initial. Bottom shows area under the curve (AUC) of TEER from 0–48 hours, normalized to that of Con. (B–D) Top shows luminal treatment of Caco2 with LGG-derived indoles showing % (of initial) TEER. Bottom depicts AUC from 0–48 hours (left) and after *Clostridium difficile* supernatant treatment (right) with (E) quantified paracellular permeability using FITC-dextran. (F–H) Similar experiments were done with metabolites applied to the basolateral compartment. (I) FITC-dextran permeability in control (media only) or LPS-treated mouse organoids. Selected metabolites were evaluated for their efficacy in protecting the permeability of LPS-treated organoids. (J) Image J-quantified FITC-dextran fluorescence in the lumen normalized to that of control. (K) Representative images showing fluorescent staining of Tjp1 (left) and Ocln (right) of organoids treated with IPA. Expression of (L) Tjp1 (ZO-1) and (M) Ocln in control, LPS-, LPS+metabolite-, and metabolite-treated organoids. (N) Representative images and (O) quantified FITC-dextran fluorescence of organoid permeability of Ocln KO organoids treated with metabolites. (P) Expression of Tff3 (left) and Lyz1 (right) with selected metabolites. (Q) Representative immunofluorescent images of TFF3 (left) and LYZ1 (right) of control organoids and those treated with IPA. (R) Number of TFF3-positive (left) and LYZ1-positive (right) cells per organoid area. Statistical significance among the groups was determined by 1-way analysis of variance, *P < .05, **P < .01, ***P < .001, ****P < .0001. CARN, carnosine; IAA, indole-3-acetic acid; IAL, Indole-3-carboxyaldehyde; IAM, indole-3-acetamide; IAN, indole-3-acetonitrile; IAR, indole-3-acrylic acid; ICA, indole-3-carboxylic acid; ICB, indole-3-carbinol; ILA, indole-3-lactic acid; IPA, indole-3-propionic acid; VEH, DMSO.

prevented DSS-induced reductions in Ocln levels (Figure 7M). Finally, interleukin-6 and tumor necrosis factor- α levels that were low before DSS administration



increased markedly in PBS-injected mice, an increase prevented or mitigated by MNA ($P < .05$) (Figure 7N).

To explore the mechanism of MNA-increased colonic healing, we examined intestinal epithelial differentiation pathway regulators and observed a DSS-induced 40% decrease in intestinal *Rnf43* transcripts. This *Rnf43* reduction was completely rescued by MNA. *Dll4* and *Notch1* displayed the same trend as *Rnf43* of being promoted by MNA in DSS mice (Figure 7O). In contrast, *Lgr5* expression seemed independent of treatment. We then validated by immunohistochemistry (Figure 7P and Q) and Western blot (Figure 7R and S) that MNA significantly increased intestinal *Rnf43* in homeostasis and during the DSS colitis recovery phase. These results collectively suggest that MNA may promote epithelial recovery by promoting enterocyte differentiation via regulating key epithelial regenerating pathways involving RNF43 and Notch.

Next, we sought to investigate to what extent the trp-NAM pathway confers protection. We treated mice with isoniazid (ISO), a known antituberculosis drug that interrupts trp absorption and NAM production.³² For 4 days before DSS-induced colitis, we administered ISO once a day. ISO treatment led to a significant decrease in body weight in ISO-DSS mice compared with PBS-DSS mice (Figure 7T). ISO exacerbated the colitis by further decreasing colonic *Ocln* and *Tjp1* while increasing colonic *IL-6* (Figure 7U). These findings collectively suggest that blocking trp-NAM absorption and metabolism exacerbated colitis.

Discussion

Using our recently developed innovative METRCA algorithm, we uncovered, then validated, specific serum and intestinal metabolites that promote or impair barrier function. Many of the metabolites we discovered correlate positively not only with barrier-promoting *Ocln* and *Tjp1*, but interestingly also with sealing claudins but not with leaky claudins. Although expression levels of these TJ components do not equate to barrier function, these results

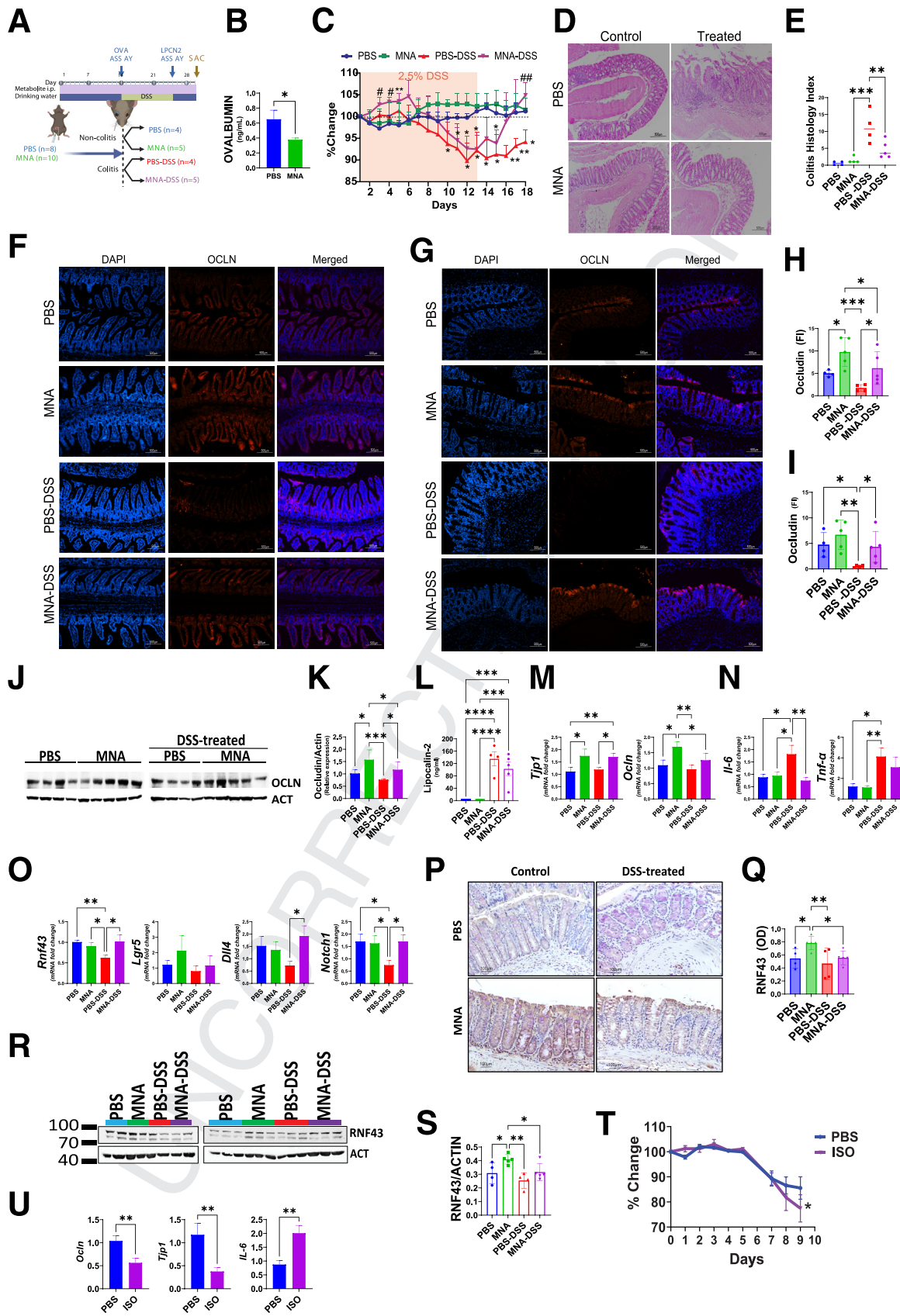
nevertheless demonstrate for the first time that LGG synergizes with a key dietary component to regulate gut epithelial differentiation and permeability by altering the abundances of barrier-modulating metabolites.

We also demonstrate here that LGG drives a dietary trp-dependent metabolic pathway involving NAM that effectively protects the gut barrier against colitogenic insult. Inflamed gut and colitis have been associated with a disrupted trp-NAM metabolism.^{33,34} We found that serum and fecal MNA, a by-product of NAM metabolism, are elevated in LGG trp+ mice. Our *in silico* analysis of a published IBD metabolomic dataset³¹ revealed that serum MNA is strongly and inversely correlated with disease activities in patients with IBD. Additionally, low MNA levels were reported in the urine of IBD cohorts³⁵ further substantiating a dysfunctional NAM metabolism during intestinal inflammation. The positive correlation of serum MNA with 10 TJ genes and its robust promotion of TEER and barrier protection *ex vivo* and *in vivo*, collectively underscore its strong barrier-promoting effects. Some strains of lactobacilli make NAM-metabolites,³⁶ and we found that LGG makes kynurenine and NAD⁺ *in vitro*, which may fuel intestinal NAM metabolism in the host cells. Indeed, most enzymes and transporters involved in *de novo* NAM synthesis, recycling, and scavenger pathways are elevated in mouse ileum in response to LGG and dietary trp. Administering exogenous MNA alleviates colitis, whereas administering inhibitors of trp-NAM absorption exacerbates colitis. Thus, we document for the first time that LGG promotes trp-NAM metabolism and that MNA is a barrier protector. Our finding may have implications for precision probiotic intervention based on patient serum MNA abundances.

The essential nature of vitamin B₃ and its derivatives as building blocks of NAD for energy is well known, but its role as nonoxidative regulators of physiologic processes is just being appreciated.^{37,38} This step of NAM-to-MNA methylation is catalyzed by NAM N-methyltransferase as a degradation pathway and is considered irreversible.³⁹ Therefore, MNA has long been viewed as an inert and transient

Figure 6. (See previous page). Serum MNA is reduced in IBD while exogenous MNA robustly promotes barrier function.

(A) Graphical illustration depicting the metabolic fate of TRP and NAM metabolites, highlighting enzymes involved in different pathways. (B) Heatmaps illustrating NAM metabolism-related genes associated with metabolite transport (blue), Preiss-Handler pathway (violet), salvage pathway (yellow), and ectoenzyme (green) in the ileum (left) and liver (right). (C) Heatmaps depicting TRP metabolism-related genes associated with TRP transport (blue) and TRP metabolism (brown) in the ileum (left) and liver (right). (D) Liquid chromatography-mass spectrometry analysis of KYN-NAM derived metabolites in the cell-free culture supernatant of LGG ($n = 3$ per group). (E) Volcano plot displaying results of differential metabolite analysis (DMA) targeting trp-NAM, derived from *in silico* IBD analysis in serum and stool of patients. Comparisons include IBD vs CN, CD vs CN, and UC vs CN. (F) DMA analysis of trp-NAM metabolites associations with clinical disease activity indices, including Simple Clinical Activity Index and Mayo endoscopic score for UC, and Harvey Bradshaw Index, and Simple Endoscopic Score for CD, with FDR < 0.10 threshold indicated by a dashed black line. (G-I) Luminal treatment of metabolites in a time-dependent manner, showing TEER of Caco-2 cells normalized to Veh ($n = 5$ per group), area under the curve (AUC) of TEER from 0–48 hours of metabolite treatment before *Clostridium difficile* toxin challenge, and AUC of % TEER 24 hours after *C. difficile* treatment. (J) Quantified paracellular permeability using FITC-dextran levels. (K-M) Basolateral treatment of metabolites in a time-dependent manner, showing AUC of TEER from 0–48 hours of metabolite treatment before *C. difficile* challenge, AUC of % TEER 24 hours after *C. difficile* treatment, and quantified paracellular permeability using FITC-dextran levels. Statistical significance among the groups was determined by 1-way analysis of variance, * $P < .05$, ** $P < .01$, *** $P < .001$, **** $P < .0001$. 2PY, N1-Methyl-2-pyridone-5-carboxamide; I7AA, 1H-indole-7-acetic acid; HPA, 5-hydroxypicolinic acid; IGA, 3-indoleglyoxylic acid; IHS, 6-hydroxyindole sulfate; IND, indole; KYN, kynurenine; MOX, nicotinamide-N-oxide; NA, nicotinic acid; NAD, NAD⁺; NAM, nicotinamide; nKYN, n-Acetylkynurenine; NMN, nicotinamide mononucleotide; NR, nicotinamide riboside; QUI, quinolinate; Trig, trigonelline; XAN, xanthurenate.



intermediate for eventual disposal via renal excretion. However, MNA is a relatively common metabolite enriched in Judas ear fungus and green tea already consumed by humans, and its potential anti-inflammatory^{40,41} and vaso-protective activities⁴² have been proposed by recent studies. The potential transporters for MNA (eg, Mate1, Mate2, OCT1-3) have only been speculated and more studies are needed; however, active uptake of exogenous MNA was shown in canine kidney^{43,44} and rat liver cells,⁴⁵ consistent with our observed effects of exogenous MNA in vivo and in vitro. We present compelling data to support MNA's positive contribution to barrier-strengthening and colonic healing. We found that injecting MNA to wild-type mice is sufficient to elevate RNF43, an E3 ubiquitin ligase that is downstream of AHR signaling and suppresses Wnt signaling by removing Frizzled receptors from cell surfaces.^{46,47} MNA also rescued DSS-induced reduction in Dll4 and Notch1 in vivo. Interestingly, LGG and dietary trp synergistically promoted RNF43 and Dll ligands, reflecting a Wnt-Off and Notch-On scenario favorable for enterocyte differentiation.⁴⁸ The Wnt-Off condition is also consistent with a suppression of all Paneth cell transcriptome. Indeed, a robustly promoted enterocyte program and a suppressed Paneth cell program were only found in LGG trp+ mice, suggesting a cellular differentiation program uniquely regulated by LGG in the presence of dietary trp. Our finding of MNA-regulated RNF43 may reflect a previously reported link of the canonical Wnt pathway with NAD⁺ salvage pathway.⁴⁹ Our finding of MNA-mediated stabilization of Ocln and RNF43 during DSS colitis indicates a promoted stem cell to enterocyte differentiation and maturation, ultimately strengthening the gut barrier and health.

"Leaky gut" allows the entry of harmful substances from the intestinal lumen into circulation, thereby triggering a cascade of metabolic alterations⁵⁰ and inflammatory⁵¹ response in the host. Because impairment of gut barrier stands as an evolutionarily conserved hallmark of aging,⁵² the light shed by this study on LGG presents a promising avenue for delaying the age-related decline in gut health. Interestingly, vitamin B₃ derivatives, such as NAM riboside, are considered as beneficial supplements for healthy aging and longevity.⁵³ In this context, our use of GF mice provided a controlled environment to dissect a simplified interplay among LGG, dietary trp, and the host. Our findings of trp-

NAM were validated in conventional mice that harbor intact gut microbiota, and highlight the reliance of certain LGG's beneficial effects on key dietary components, such as trp. Our metabolome-based observations may apply to other lactobacilli species. *Lactocaseibacillus plantarum* improves barrier function by enhancing TJ proteins,⁵⁴ whereas *Lactocaseibacillus acidophilus* increases mucin production.⁵⁵ *Lactocaseibacillus casei* influences antimicrobial peptide production, bolstering host defense,⁵⁶ and *Lactocaseibacillus reuteri* regulates cytokine release to influence intestinal epithelium.⁵⁷ Our study suggests that the salutary effects of probiotics may be enhanced by trp supplementation, and the inconsistent findings may be attributed to dietary differences in previous studies. Furthermore, LGG-derived indoles demonstrate improvements in disrupted barriers in Caco-2 and enteroid models. Noteworthy indoles, such as indole-3-propionic acid,⁵⁸ indole-3-acetic acid,⁵⁹ indole-3-lactic acid,⁶⁰ indole-3-pyruvate,⁶¹ and indole-3-aldehyde⁶¹ have been shown in various investigations to promote gut homeostasis by activating AHR⁶¹ and PXR receptors.^{62,63} These receptors, in turn, may regulate the integrity of epithelial and immune cells, highlighting the broader implications of probiotic interventions. Future work will delineate how MNA stimulates TJ gene expression and barrier function. We conclude that LGG stimulates dietary trp-dependent production of barrier-protecting MNA.

Materials and Methods

Animal procedures and protocols were in accordance with the Institutional Animal Care and Use Committee, Rutgers New Jersey Medical School.

Experimental Designs

Gnotobiotic study. GF mice (C57BL/6, Charles River Laboratories) were fed either trp-free or trp-sufficient diets.³⁰ The trp-sufficient diet, containing 0.2% trp, had otherwise exactly the same composition as the trp-free. Mice were acclimatized for 2 weeks then divided into 4 groups, 2 of which were fed trp-sufficient, and the other 2 fed trp-free diets for another 2 weeks (Figure 1A). At Week 0, mice in trp-free and trp-sufficient conditions were divided into cohorts that were gavaged with either LGG (10⁸ CFU/mL in 200 μ L PBS) or sterile PBS. Mice were continuously fed with

Figure 7. (See previous page). MNA mitigates DSS colitis and promotes colonic healing in mice. (A) Experimental design for assessing MNA efficacy against 2.5% DSS-induced colitis. (B) Serum ovalbumin levels (ng/mL) following 2 weeks of MNA (n = 10) or PBS (n = 8) administration (intraperitoneal, every other day). (C) Body weight changes (% of initial) of mice during DSS induction and recovery periods. Data are mean $\pm$ standard error. Significant differences are denoted as **P* < .05, ***P* < .01 vs PBS group; and #*P* < .05, ##*P* < .01 for PBS-DSS vs MNA-DSS groups. (D) Representative images of colon sections stained with hematoxylin and eosin. (E) Blinded assessment of Mouse Colitis Histology Index (MCHI) score following the recovery period from DSS treatment. Representative images of immunofluorescent staining in (F) ileum and (G) colon, with quantitative analysis of Ocln expression in the (H) ileum and (I) colon. (J) Western blot analysis of Ocln and β -actin (Act) in the ileum, and (K) corresponding quantification. (L) Fecal lipocalin-2 (Ipcn2) levels in different groups after DSS treatment. (M-O) Quantitative reverse transcription polymerase chain reaction analysis of gene expression (*Tjp1*, *Ocln*, *Il-6*, *Tnf- α* , *Rnf43*, *Lgr5*, *Dll4*, *Notch1*) in the colon at sacrifice. (P) Representative IHC images, and (Q) quantitative analysis of Rnf43 in the colon. (R) Western blot analysis of colon RNF43, and (S) corresponding quantification. (T) Evaluation of trp-NAM deficiency via ISO treatment, including changes in body weight (n = 4 for both PBS and ISO treatment groups). (U) Expression of *Ocln*, *Tjp1*, and *Il-6* in the colon at sacrifice. Statistical significance among the groups was determined by 1-way analysis of variance, **P* < .05, ***P* < .01, ****P* < .001, *****P* < .0001.

trp-free and trp-sufficient diets until sacrifice 21 days after inoculation. Fecal pellets were collected before and after inoculation. Feces, intestine, serum, and liver were collected at sacrifice.

LGG administration and GF monitoring. LGG was cultured (37°C) in MRS broth and centrifuged (1200 × *g*, 10 minutes) to pellet before gavaging to mice. Body weight and feeding rate were monitored. GF status before inoculation was validated by a commercial vendor (IDEXX) and constantly monitored in-house by fecal DNA analysis of bacterial 16S rRNA. After inoculation, qPCR for fecal DNA with 16S rRNA and LGG-specific primers were used to confirm colonization. Same engraftment efficiency of LGG was found in mice fed with trp+ or trp- diets. LGG qPCR primers are: forward, 5'-CGCCCTTAACAGCAGTCTTC-3' and reverse, 5'-GCCCTCCGTATGCTTAAACC-3'. The 16S rRNA qPCR primers are forward 5'-AGAGTTTGATCCTGGCTCAG-3', and reverse, 5'-CTTGTGCGGGCCCCGTCATTC-3'.

Intestinal perfusion. Procedures followed previous work.⁶⁴ Mice were perfused with live LGG (3.3X10⁸ CFU/mL) + Inulin (3.3 mg/mL), or with Krebs-Ringer Buffer + inulin. After 4 hours of perfusion, the intestines were collected for RNA sequencing.

DSS-induced colitis and metabolite treatment. C57BL/6 mice were intraperitoneally injected with PBS or 30 mg/kg MNA every other day for 2 weeks then gavaged with 100 µg/kg chicken ovalbumin (Figure 7A). About 24 hours postgavage, plasma ovalbumin levels were quantified using an enzyme-linked immunosorbent assay kit (abx555335, Abbexa, UK) to determine gut permeability in homeostasis. For DSS experiments, the mice were grouped into PBS, MNA, PBS+DSS, and MNA+DSS cohorts and subjected to 2.5% DSS treatment for 11 days, followed by a 5-day recovery period. MNA was injected every other day after initiation of DSS treatment. After sacrifice, tissues were collected for immunohistochemistry and immunofluorescence staining, qPCR, and Western blot analysis, whereas fecal samples from Day 11 were analyzed for lipocalin 2 levels using enzyme-linked immunosorbent assay (ab199083).

Caco-2 transepithelial electrical resistance and paracellular flux. Cells (20,000 per well) were suspended in Dulbecco's modified eagle medium media (20% fetal bovine serum, 1% Primocin) in 96-well transplates (MilliporeSigma PSHT004R5) and polarized for 21 days. TEER was measured with an EVOM system using an STX100 electrode (World Precision Instruments). Indole and NAM-derived metabolites were added apically or basolaterally (Table 1). To induce barrier disruption and assess efficacy of metabolites to repair disruption, Caco-2 monolayers were treated with 0.15% vol/vol *C. difficile* cell-free supernatant. Paracellular flux was assessed by introducing FITC-dextran (5 mg/mL) to apical chambers, and FITC fluorescence in 10 µL samples from the basolateral chamber was measured in a black 96-well plate (Costar 3915) using a Glomax (Promega, WI) plate reader (excitation: 490 nm, emission: 520 nm).

Intestinal organoid treatment with LPS and metabolites. Enteroids were isolated as previously described.⁴⁸ To grow wild-type and *Ocln* KO enteroids, *Ocln*^{fl/fl} and

Table 1. Metabolite Dosing Information

Metabolites	Dose	Application
Kynurenine	10 mM	Caco-2 luminal/ basolateral treatment
Nicotinamide riboside	10 mM	
Nicotinamide mononucleotide	10 mM	
NAD ⁺	10 mM	
Nicotinamide	10 mM	
Methylnicotinamide	10 mM	Caco2 basolateral treatment
Indole-3-acetamide	500 µM	
Indole-3-carboxyaldehyde	500 µM	
Indole-3-lactic acid	500 µM	
Indole-3-propionic acid	500 µM	
Indole-3-acrylic acid	250 µM	
Indole-3-carbinol	250 µM	
Indole-3-acetamide	250 µM	Caco2 luminal treatment
Indole-3-acetic acid	250 µM	
Indole-3-acetonitrile	250 µM	
Indole-3-carboxylic acid	250 µM	
Indole-3-carboxyaldehyde	100 µM	
Indole-3-lactic acid	50 µM	
Indole-3-propionic acid	100 µM	
Indole-3-acrylic acid	250 µM	
Indole-3-carbinol	100 µM	
Indole-3-propionic acid	0.1 mM	Enteroids
Indole-3- acetamide	200 µM	
Methylnicotinamide	87 nM	
Carnosine	20 mM	

Ocln^{fl/fl}-Vil/CRE^{ERT2} mice were injected (intraperitoneally) with tamoxifen and sacrificed 7 days after the injection to establish organoids. Day 0 was when enteroids were seeded. On Day 3, media were replaced with LPS (1 µg/mL) with or without metabolites (indole-3-propionic acid [0.1 mM],⁶⁵ indole-3-acetamide [200 µM], MNA [12 ng/mL], carnosine [20 mM]), incubated for 48 hours, and analyzed.

Bulk RNA sequencing. Before analyses, the high quality of extracted ileal RNA from all samples was confirmed (RIN, 8.6 ± 0.56). Total RNA was subjected to poly(A) selection using oligo(dT)25 magnetic beads (New England Biolabs). Libraries were constructed using Next (New England Biolabs) Ultra II RNA library preparation with sample purification beads and Next Multiplex Oligos. Poly(A) selection and library quality were assessed using TapeStation 2200 (Agilent) and libraries quantified (Qubit 4.0 fluorometer, ThermoFisher). The prepared libraries were sequenced (Illumina NextSeq 500) then analyzed by CLC Genomics Workbench 20.0.4.

Metabolite extraction and liquid chromatography-mass spectrometry analysis. Feces and liver metabolites were extracted using the reported procedures.²⁹ Serum metabolites were extracted in methanol (ratio of serum:methanol, 1:4) at -20°C for 20 minutes, and centrifuged at 17,000 × *g* for 2 minutes. Supernatants were stored on ice. The pellet was further extracted in acetonitrile:methanol:water (400:400:200), for 10 minutes on ice, centrifuged at 17,000 × *g* for 10 minutes, and the supernatant combined with the first extraction. Liquid chromatography-mass spectrometry analysis was performed as previously described.²⁹ The metabolite data were analyzed in MAVEN (Metabolic Analysis and Visualization

Engine). Compound identification used the accurate mass and the retention time learned from an in-house chemical library. MetaboAnalyst 5.0 was then used for further statistical and functional interpretation of metabolomics data. Finally, principal component analysis and variables important in the projection (cutoff 1.2²⁹) analyses were used to identify those metabolites substantially driving differences between 2 treatments.

RT-qPCR analysis. Primers used include: β -actin (*Actb*), forward 5'-TTG TTA CCA ACT GGG ACG ACA TGG-3', reverse 5'-CTG GGG TGT TGA AGG TCT CAA ACA-3'; ZO-1 (*Tjp1*), forward 5'-GGG AGG GTC AAA TGA AGA CA-3', reverse 5'-GGC ATT CCT GCT GGT TAC AT-3'; *Ocln*, forward 5'-ATT CCA TCA GTT TCC TAT CT-3', reverse 5'-ACC AGG ACC TTT CTT GAC-3'; *Lyz1*, forward 5'-ATG GCT ACC GTG CT TCA AG-3', reverse 5'-CGG TCT CCA CGG TTG TAG TT-3'; *Tff3*, forward 5'-TAA TGC TGT TGG TGF TCC TG-3', reverse 5'-CAG CCA CGG TTG TTA CAC TG-3'; *Dll4*, forward 5'-AGC TGG AAG TGG ACT GTG GT-3', reverse 5'-TAG AGT CCC TGG GAG AGC AA-3'; *Rnf43*, forward 5'-CCG GGT CAT TTC GTG CCT C-3', reverse 5'-CCT GGT TCC TGG TAA GAT GGA-3'; *Lgr5*, forward 5'-TGA GCG GGA CCT TGA AGA TT-3', reverse 5'-AGG TGC TCA CAG GGC TTG AA-3'; Notch1, forward 5'-ATG TCG ATG TTC GAG GAC CAG-3', reverse 5'-TCA CTG TTG CCT GTC TCA AG-3'; *IL-6* forward 5'-ACC ACG AGG ATC AGT ACG AA-3', reverse 5'-TGT TCFG CAT AAG GGC TCT GT-3'; *Tnf- α* forward 5'-GAT CTC AAA GAC AAC CAA CAT GTG-3', reverse 5'-CTC CAG CTG GAA GAC TCC AAB CAG-3'. All samples were normalized to β actin.

Permeability and immunohistochemistry. Permeability and immunohistochemistry of enteroids were described previously.⁴⁸ For colon and ileal tissues, the sections (5 μ m) underwent antigen retrieval in 0.1 M citrate acid buffer (pH 6) at subboiling temperature for 20 minutes. Following blocking with PBS containing 0.1% Triton X-100, 2% normal serum, and 2% bovine serum albumin for 1 hour at room temperature, slides were incubated with primary antibodies overnight at 4°C. After 3 PBS washes, slides were incubated with fluorescent dye-conjugated secondary antibodies for 1 hour at room temperature, followed by DAPI nuclear counterstaining for 10 minutes. Mounted (Prolong Gold Antifade Mountant) slides were imaged at 10X magnification with 3 representative sections per mouse using Nikon TE2000. Quantitative analysis was performed using Image J. Primary antibodies were diluted in blocking buffer. Primary antibodies were rabbit monoclonal OCLN, mouse monoclonal ZO-1 and TFF3 (AB216327, 1A12 and 14475882, respectively, ThermoFisher) and rabbit polyclonal LYZ1 (PU024-5UP, Biogenex).

METRCA. Correlation analysis between metabolome and transcriptome used our newly developed R script.³⁰ Transcriptome data were filtered and only differentially expressed genes (fold change >1.5, FDR-adjusted $P < .05$) were considered. Pairwise Pearson correlation coefficients were calculated between genes and metabolites, and their statistical significance was obtained via the cor.test function in R. Metabolite-gene pairs with FDR-adjusted $P < .05$ were significantly associated. Heatmap was generated by pheatmap package in R. Genes were clustered by hierarchical clustering.

Statistical analysis. All results are expressed as mean $\pm$ standard error of the mean. Significance was determined by 1-way or 2-way analysis of variance, Student t test, and Tukey post hoc test. Animal numbers were described in each figure panel with individual data points plotted in the graphs.

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Conflicts of interest

The authors disclose no conflicts.

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