Metabolome-associated psychological comorbidities improvement in irritable bowel syndrome patients receiving a probiotic

Francois-Pierre Martin<sup>a</sup>, Ornella Cominetti<sup>b</sup>, Bernard Berger<sup>a</sup>, Séverine Combremont<sup>a</sup>, Julien Marquis<sup>a</sup>, Guoxiang Xie<sup>c,d</sup>, Wei Jia<sup>c,e</sup>, Maria Inés Pinto-Sanchez<sup>f</sup>, Premysl Bercik<sup>f</sup>, and Gabriela Bergonzelli<sup>a</sup>

<sup>a</sup>Nestlé Institute of Health Sciences, Société des Produits Nestlé S.A, Lausanne, Switzerland; <sup>b</sup>Nestlé Institute of Food Safety and Analytical Sciences, Société des Produits Nestlé S.A, Lausanne, Switzerland; <sup>c</sup>University of Hawaii Cancer Center (UHCC), Honolulu, HI, USA; <sup>d</sup>Human Metabolomics Institute, Inc, Shenzhen, Guangdong, China; <sup>e</sup>School of Chinese Medicine, Hong Kong Baptist University, Hong Kong, China; <sup>f</sup>Department of Medicine, Farncombe Family Digestive Health Research Institute, McMaster University, Hamilton, ON, Canada

#### Abstract

Our recent randomized, placebo-controlled study in Irritable Bowel Syndrome (IBS) patients with diarrhea or alternating bowel habits showed that the probiotic Bifidobacterium longum (BL) NCC3001 improves depression scores and decreases brain emotional reactivity. However, the involved metabolic pathways remain unclear. This analysis aimed to investigate the biochemical pathways underlying the beneficial effects of BL NCC3001 using metabolomic profiling. Patients received probiotic (1x 10<sup>10</sup>CFU, n=16) or placebo (n=19) daily for 6 weeks. Anxiety and depression were measured using the Hospital Anxiety and Depression Scale. Brain activity in response to negative emotional stimuli was assessed by functional Magnetic Resonance Imaging. Probiotic fecal abundance was quantified by qPCR. Quantitative measurement of specific panels of plasma host-microbial metabolites was performed by mass spectrometry-based metabolomics. Probiotic abundance in feces was associated with improvements in anxiety and depression scores, and a decrease in amygdala activation. The probiotic treatment increased the levels of butyric acid, tryptophan, N-acetyl tryptophan, glycine-conjugated bile acids, and free fatty acids. Butyric acid concentration correlated with lower anxiety and depression scores, and decreased amygdala activation. Furthermore, butyric acid concentration correlated with the probiotic abundance in feces. In patients with non-constipation IBS, improvements in psychological comorbidities and brain emotional reactivity were associated with an increased abundance of BL NCC3001 in feces and specific plasma metabolites, mainly butyric acid. These findings suggest the importance of a probiotic to thrive in the gut and highlight butyric acid as a potential biochemical marker linking microbial metabolism with beneficial effects on the gut-brain axis.

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#### Introduction

For millennia, traditional medicine has acknowledged the deep and complex relationships between the gut and the brain. More recently, growing scientific evidence has confirmed the existence of the gut-brain axis (GBA), the bidirectional communication between the gut and the brain that involves endocrine, neural, and immune signaling pathways.<sup>1</sup> The gut microbiota is believed to interact with these pathways and to contribute with additional signaling, such that the concept is regularly extended to the microbiota-gut-brain axis. The microbiota has been associated with the modulation of gut homeostasis,<sup>2</sup> and even with processes affecting brain development, physiology, behavior, and psychology.<sup>3</sup> Gut bacteria have been shown to produce and degrade neuroactive compounds such as biogenic amines,<sup>4</sup> γ-aminobutyric acid (GABA),<sup>5</sup> serotonin, tryptophan,<sup>6</sup> and shortchain fatty acids such as butyric acid<sup>7</sup> that may reach the brain via circulation and the bloodbrain barrier and/or activate neural pathways.<sup>8</sup>

Irritable bowel syndrome (IBS) is a common digestive disorder characterized by abdominal pain and altered bowel habits, and is frequently accompanied by psychiatric comorbidities.<sup>9</sup> Disorders such as IBS, which were previously

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**CONTACT** Bernard Berger bernard.berger@rdls.nestle.com Nestlé Research, Nestlé Institute of Health Sciences, Société des Produits Nestlé S.A, Route du Jorat 57, Lausanne 26 1000, Switzerland

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described as functional gastrointestinal disorders, have recently been defined as disorders of gutbrain interaction.<sup>10</sup> Perturbation of bidirectional GBA is increasingly recognized as a conceptual model of IBS pathophysiology, involving dysfunction of the enteric, autonomic, and central nervous systems (CNS).<sup>11</sup> Indeed, stress can trigger the onset or aggravate the severity of IBS symptoms (top-down model). On the other hand, intestinal symptoms can promote or aggravate psychological disorders (e.g., depression and anxiety) and decrease health-related quality of life (bottom-up model).<sup>12</sup>

Recent evidence obtained from germ-free mice colonized with human microbiota supports a role of the gut bacteria in IBS pathogenesis, including its psychological comorbidity.<sup>13</sup> In multiple casecontrol studies, changes in microbiota composition and function have been linked to several disease states,<sup>14</sup> ranging from gastrointestinal to neurological conditions. It has been postulated that modulation of the gut microbiome or consumption of specific probiotics might lead to beneficial changes in CNS functions.<sup>15</sup>

We have previously demonstrated that, in IBS patients with diarrhea or mixed bowel habits, a 6-week intervention with the probiotic Bifidobacterium longum subsp. longum (BL) NCC3001 reduced depression scores and responses to negative emotional stimuli in multiple brain areas, including the amygdala and fronto-limbic regions, compared to placebo.<sup>16</sup> We found that gut metabolites were altered by BL NCC3001 consumption, despite having no major impact on the microbiota composition.<sup>16</sup> Notably, the probiotic group had reduced urine levels of methylamines and metabolites derived from tyrosine compared with the placebo group. These observations suggest a shift in the bacterial metabolism of amines and amino acids, including a decrease in the production of the host-bacterial co-metabolite 4-cresol sulfate. This molecule inhibits dopamine  $\beta$ hydroxylase, an enzyme involved in the conversion of dopamine to noradrenaline. However, the precise molecular mechanisms underlying the beneficial effects of BL NCC3001 in the brain remain poorly understood. Here, we applied a targeted quantitative metabolic profiling approach for plasma analysis combined with a measure of fecal BL NCC3001 abundance and integrated them with clinical and brain imaging outcomes to generate deeper insights into the potential mechanisms involved in the central effect of BL NCC3001.

## Results

#### Study patients and biological samples

From the 38 patients who completed the study (BL NCC3001 = 18, placebo = 20), metabolomic analysis of blood samples was conducted in the 36 participants whose samples were available for both preand post-intervention (BL NCC3001 = 18, placebo = 18). The abundance of BL NCC3001 in feces was assessed in 35 participants (BL NCC3001 = 16, placebo = 19) and amygdala activation was measured in 25 participants (BL NCC3001 = 11, placebo = 14).

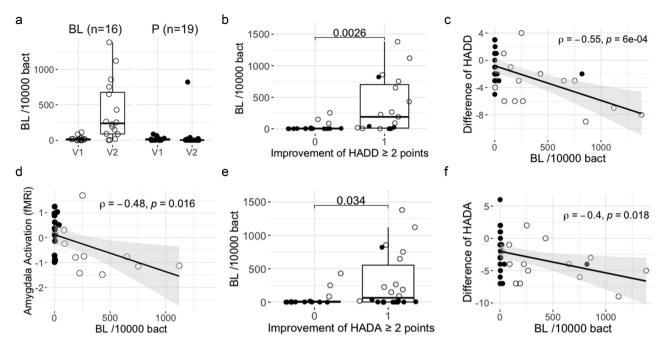
# BL NCC3001 quantification and association with clinical outcomes

Using a quantitative PCR assay, we determined the relative abundance of BL NCC3001 in the feces of the participants (Figure 1a). A High BL NCC3001 abundance was detected only in the BL NCC3001 group, except for one subject in the placebo group at the third visit (end of treatment).

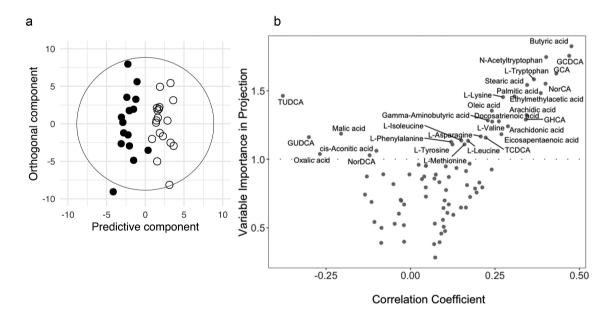
The reduction of two points or more in either HADD (Figure 1b) or HADA (Figure 1e) scores – used as primary outcome of the trial – was associated with an increased abundance of BL NCC3001 (Wilcoxon test; p = .003 and p = .034, respectively). The decrease in both scores (Figures 1c & f) correlated with the abundance of BL NCC3001 (rho = 0.55, p = 6e-04 and rho = -0.4, p = .018, respectively). Decreased amygdala activation in response to negative stimuli, as assessed by functional Magnetic Resonance Imaging (fMRI), was also correlated with probiotic abundance rho = -0.48, p = .016, Figure 1d).

# Effect of the probiotic intervention on blood metabolites

OPLS discriminant analysis was applied using one predictive component and one orthogonal component to model the blood metabolic differences



**Figure 1.** Fecal BL NCC3001 relative abundance and associations with clinical outcomes. A) BL NCC3001 abundance in feces at baseline (V1) and at the end of intervention (V2) per group. B) Fecal BL NCC3001 abundance in responders [ $\geq$ 2 points improvement in HADD score (1)] and not responders [<2 points improvement in HADD score (0)]; p-value of Wilcoxon test. C) Correlation between the difference of HADD score (V2-V1) and BL NCC3001 abundance at V2; Spearman test. D) Correlation between amygdala activation (fMRi) and BL NCC3001 abundance at V2; Spearman test. E) Fecal BL NCC3001 abundance in responders [ $\geq$ 2 points improvement in HADA score (1)] and non-responders [<2 points improvement in HADA score (0)]; p-value of Wilcoxon test. F) Correlation between the difference in HADA score (V2-V1) and BL NCC3001 abundance at V2; Spearman test. BL NCC3001 (BL, open circle); Placebo (P, closed circle).



**Figure 2.** OPLS samples and variable plots. (A) OPLS Score plot derived from plasma metabolic profiles. The cross-validated scores plot showed statistically significant separations between the blood profiles obtained post-intervention from placebo (closed circle) and BL NCC3001 (open circle) treated patients. (B) OPLS variables plots describing influential variables contributing to the separation observed in the scores plots, according to variable importance in projection (threshold >1.0) and the correlation coefficient.

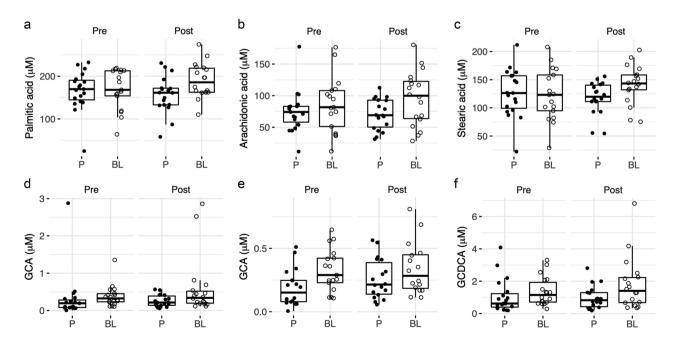
Table 1. Overview of	plasma metabolite	differences according	to treatment and time.

	OP	LS						
	param	eters.	Blood concentrations (Mean (SD))			P-value	P-value	
Metabolites (unit)	Coeff	VIP	Placebo Pre	Placebo Post	BL NCC3001 Pre	BL NCC3001 Post	Pre	Post
Arachidic acid (ng/mL)	0.34	1.32	258.1 (233.6)	143.4 (142.9)	212 (143.7)	241.5 (147.6)	0.476	0.057
Arachidonic acid (ng/mL)	0.29	1.24	74831.5 (33085.7)	73022.8 (23563.8)	85945.1 (44065.4)	95695.5 (43008.9)	0.403	0.043
Butyric acid (ng/mL)	0.48	1.83	91.5 (45.9)	72.0 (29.6)	65 (25)	103.5 (37.2)	0.038	0.008
Docosatrienoic acid (ng/mL)	0.26	1.28	14736.4 (6929.5)	14035.0 (6178.5)	14103.9 (4891.4)	18435.1 (7955)	0.752	0.064
Eicosapentaenoic acid (ng/	0.27	1.18	389870.2	387660.8	436787.9	475388.7	0.429	0.077
mL)			(148890.7)	(140034.1)	(195879.5)	(171320.1)		
Ethylmethylacetic acid (ng/	0.39	1.48	30.2 (63.9)	34.5 (71.8)	33.6 (67.3)	89 (88.2)	0.881	0.050
mL)								
GCA (nM)	0.43	1.63	331.2 (632.3)	258.7 (158)	385.2 (291.2)	602.2 (786.1)	0.739	0.085
GCDCA (nM)	0.47	1.76	1069.2 (1042.4)	980.8 (707.6)	1371.9 (887.7)	1807.2 (1632.6)	0.347	0.061
GUDCA (nM)	-0.30	1.16	35.6 (61.1)	69.7 (128.5)	54.9 (106)	17.6 (23.4)	0.508	0.108
L-Asparagine (ng/mL)	0.21	1.17	9083.2 (4325.8)	9021.8 (4593.8)	9555.4 (2702.9)	10726 (1283.3)	0.694	0.155
L-Tryptophan (ng/mL)	0.37	1.58	16181.8 (4381.5)	15788.6 (4257.6)	17504.5 (1917.2)	17740.3 (1537.6)	0.244	0.081
Malic acid (ng/mL)	-0.21	1.19	255.1 (302.9)	497.9 (679.3)	340.7 (472.3)	331.4 (404.5)	0.528	0.372
N-acetyl-tryptophan (ng/mL)	0.40	1.75	36953.1 (12532.5)	35349.5 (11388.5)	40921.5 (8513.5)	41968.6 (6827.7)	0.271	0.044
Oleic acid (ng/mL)	0.24	1.35	407483.2 (119185)	372474.5	377034.6	447659.5	0.491	0.131
				(120852.2)	(140261.3)	(140379.6)		
Palmitic acid (ng/mL)	0.31	1.46	166557.1 (46476.1)	156101.2 (44850.9)	169164.7 (46423.7)	189971.6 (40260.8)	0.868	0.024
Stearic acid (ng/mL)	0.35	1.54	126420.4 (42195.5)	117539.2 (29871.9)	123284.8 (46273.5)	141693.9 (34051.4)	0.834	0.028
TUDCA (nM)	-0.38		29.1 (27.4)	51.6 (36)	26.9 (25)	30.3 (20.4)	0.806	0.052

Legend: Coeff: OPLS Correlation coefficient, VIP: OPLS Variable Importance in Projection; p-value: Wilcoxon signed rank test between placebo and BL NCC3001 group post intervention.

between the two groups (Figure 2). The model was statistically robust only for post-treatment analysis ( $R^2X = 0.19$ ,  $R^2Y = 0.76$ ,  $Q^2Y = 0.26$ , where  $R^2X$ : explained variance in the metabolomic data (plasma metabolites),  $R^2Y$ : explained group variance (placebo and probiotic) and  $Q^2Y$ : robustness of the model). Before treatment, there was no

difference between the two groups ( $Q^2Y < 0$ ) (Table 1), and when considered separately, none of the metabolites were significantly different, except for butyric acid, which was slightly higher in the placebo group (p = .0378, see below). Patients receiving BL NCC3001 for 6 weeks exhibited higher plasma concentrations of several fatty



**Figure 3.** Overview of changes in plasma fatty acids and bile acids. Concentrations of metabolites in plasma at baseline (V1) and end of intervention (V2) per group: A) palmitic acid, B) arachidonic acid, C), stearic acid, D) glycine conjugated cholic acid (GCA), E) glycine conjugated cholic acid (GCA) without outliers, F) glycine-conjugated chenodeoxy cholic acid (GCDCA). BL NCC3001 (BL, open circle); Placebo (P, closed circle).

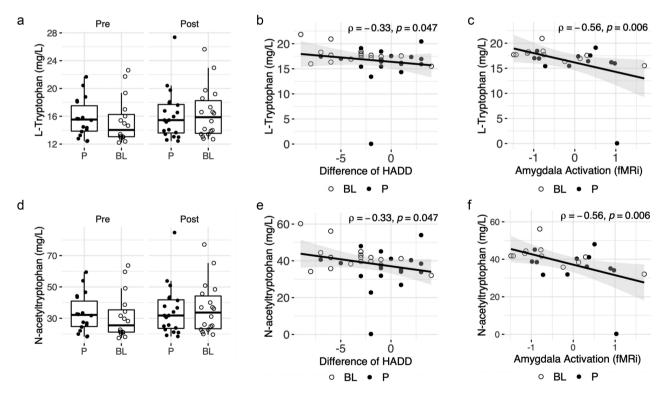
acid species (e.g., arachidonic, palmitic, and stearic acid; p < .05, Figures 3a–c), of the amino acid N-acetyl-tryptophan (p < .05, Figure 4d), and of butyric acid (p < .05, Figure 5a), compared to patients receiving placebo. These changes paralleled trends for higher concentrations of the branched-chain fatty acid ethylmethylacetic acid, several glycine conjugated bile acid species such as glycocholic acid (GCA) and glycochenodeoxycholic acid (GCDCA) and fatty acids (e.g., arachidic, docosatrienoic, and eicosapentaenoic acids), and in the amino acid tryptophan (p < .1, Figures 3c,d,e & 4a). Patients receiving BL NCC3001 also had lower plasma concentration of the bile acid TUDCA (p = .052).

## Associations of metabolites with clinical outcomes and fecal BL NCC3001 abundance

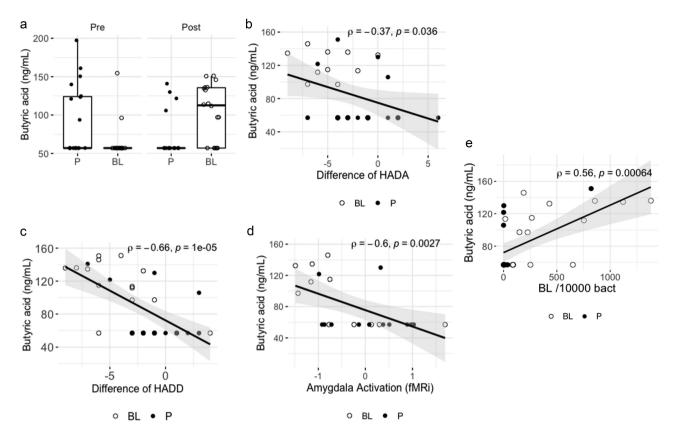
Several metabolites were associated with changes in clinical outcomes and abundance of BL NCC3001

(Supplementary Table S1). There was a strong correlation between the levels of butyric acid and the reduction in the HADD score in the BL NCC3001 group and in the entire study population rho = -0.67, p = .002 and rho= -0.66, p = .00001, respectively; Figure 5c). Butyric acid levels in the whole study population also correlated with a decrease in amygdala activation (rho= -0.50, p = .016, Figure 5d) and HADA scores (rho= -0.35, p = .034, Figure 5b).

The decrease in amygdala activation was also strongly associated with higher plasma levels of tryptophan (rho= -0.66, p = .031 and rho= -0.56, p = .006, respectively; Figure 4c), N-acetyl tryptophan (rho= -0.66, p = .031 and rho= -0.56, p= .006, respectively; Figure 4f), and the fatty acid pentadecanoic acid (rho= -0.66, p = .031 and rho= -0.55, p = .007, respectively) in the BL NCC3001 group and the entire study population (Table 1). The increases in plasma levels of tryptophan (rho= -0.33, p = .047, Figure 4b), N-acetyl tryptophan



**Figure 4.** Overview of changes in plasma tryptophan, N-Acetyl tryptophan, and associations with clinical endpoints. A) Concentrations of tryptophan in plasma at baseline (V1) and end of intervention (V2) per group, B) Correlation between the difference of HADD score (V2-V1) and tryptophan concentration in plasma at V2; Spearman test. C) Correlation between amygdala activation (fMRi) and tryptophan concentration in plasma at V2; Spearman test. D) Concentrations of N-acetyltryptophan in plasma at baseline (V1) and end of intervention (V2) per group, E) Correlation between the difference in HADD score (V2-V1) and N-acetyltryptophan concentration in plasma at V2; Spearman test. F) Correlation between amygdala activation (fMRi) and plasma at V2; Spearman test. F) Correlation between amygdala activation (fMRi) and plasma tv2; Spearman test. BL NCC3001 (BL, open circle); Placebo (P, closed circle).



**Figure 5.** Overview of changes in plasma butyric acid and associations with clinical endpoints and fecal BL NCC3001 counts. A) Concentrations of butyric acid in plasma at baseline (V1) and end of intervention (V2) per group, B) Correlation between the difference in HADA score (V2-V1) and butyric acid concentration in plasma at V2; Spearman test, C) Correlation between the difference in HADD score (V2-V1) and butyric acid concentration in plasma at V2; Spearman test. D) Correlation between amygdala activation (fMRi) and butyric acid concentration in the plasma at V2; Spearman test. E) Correlation between fecal BL NCC3001 abundance and butyric acid concentration in plasma at V2; Spearman test. E) Correlation between fecal BL NCC3001 abundance and butyric acid concentration in plasma at V2; Spearman test. BL NCC3001 (BL, open circle); Placebo (P, closed circle).

(rho= -0.33, p = .047, Figure 4e), and arachidic acid (rho= -0.36, p = .029) were also correlated with decreased HADD scores in the whole study population (Supplementary Table S1).

The plasma level of butyric acid was positively associated with the abundance of BL NCC3001 measured in the feces (rho = 0.59, p = .016 and rho = 0.56, p = .00064, Figure 5e) in the BL NCC3001 group and the entire study population, respectively.

#### Discussion

We previously showed in this randomized, placebo-controlled study that a 6-week administration of BL NCC3001 lowered depression scores and decreased responses to fearful stimuli in multiple brain areas involved in the processing of emotions, including the amygdala and fronto – limbic regions. Here, we demonstrated that these changes were associated with the abundance of BL NCC3001 as measured in feces and plasma levels of several metabolites, including butyric acid, tryptophan, N-acetyl tryptophan, glycine-conjugated bile acids, and free fatty acids. Of these, butyric acid was strongly correlated with lower anxiety and depression scores and decreased amygdala activation, suggesting that it could play a key role in the beneficial effect of the probiotic.

Measurements of BL NCC3001 abundance in feces revealed that there was overall good compliance with probiotic intake. Interestingly, a high level of BL NCC3001 was detected in one patient in the placebo group at the end of treatment. Although *Bifidobacterium longum* subsp. *longum* is common in the adult gut microbiota,<sup>17</sup> this marked increase suggests that the patient likely consumed a dietary product or probiotic supplement containing a very closely related strain, since it was detected by our assay targeting a strainspecific chromosomal region of the bacterium. The genomic signature of the strain detected in this sample was further investigated by three PCR assays targeting other strain-specific regions of the NCC3001 chromosome (the sites of insertion of mobile genetic elements), which were all positive, further demonstrating the relatedness of this strain with BL NCC3001 (data not shown). It is noteworthy that the same study participant showed an improvement in the HADD and HADA scores, consistent with the strain-specificity of the probiotic effect.

The supplementation with BL NCC3001 modulated the blood plasma biochemical composition, from which only a few metabolites changed and correlated with improvements in amygdala reactivity, anxiety, or depression scores – namely bile acids, short chain fatty acids, and amino acids.

Amongst major metabolic changes not associated with clinical outcomes were increased plasma fatty acids, which may relate to other external factors, such as lifestyle.<sup>18</sup> Here, BL NCC3001 administration increased saturated and polyunsaturated fatty acids (PUFAs), namely palmitate (C16), stearate (C18), arachidonate (C20:4), and oleate (C18:1), possibly by modulating fatty acid absorption and bioavailability.<sup>19</sup> IBS patients have been reported to have a distinct composition of polyunsaturated fatty acids (PUFAs) in gut biopsies and blood samples.<sup>20,21</sup> PUFAs have been shown to regulate brain function through multiple mechanisms, including the hypothalamic-pituitary-adrenal axis, neuroendocrine, and immune regulations. <sup>19–</sup> <sup>21</sup> Arachidonic acid may impact the pathophysiology of depression by affecting serotonin transport<sup>22,23</sup> whilst blood oleic acid is associated with a lower incidence of depression,<sup>24</sup> although its underlying mechanisms are not well understood.<sup>16,25-27</sup> BL NCC3001 increased the levels of two primary bile acids, GCA and GCDCA, which correlated with improvement in anxiety scores. The probiotics may exert some of its benefits, directly or indirectly, through metabolic functions related to bile acid absorption and enterohepatic recirculation, factors shown to be impaired in 40% of IBS patients.<sup>28</sup> The shift in the bile acid pattern toward glycine-conjugates can be explained by a reduction in bile salt hydrolase activity by bacteria in the small intestine. As the

conjugation of bile acids increases their solubility and lipid emulsification properties,<sup>29</sup> higher levels of GCA and GCDCA, and fatty acids in the BL NCC3001 group may indicate increased lipid emulsification and absorption. Recent studies have suggested that bile acids have neuroprotective effects in models of Huntington's disease<sup>30</sup> and Alzheimer's disease.<sup>31,32</sup> Upon absorption and blood circulation, bile acids may exert their central effects via the bile acid receptors FXR and TGR5 signaling pathways.<sup>33,34</sup> The G-protein coupled receptor TGR5 is expressed in various brain regions and acts as a neurosteroid receptor,<sup>33</sup> suggesting a potential cross talk between neurosteroids and bile acids. Neurosteroids classically act to modulate GABAergic tone. In fact, CDCA has been recently shown to antagonize GABAA and NMDA receptors.<sup>35</sup>

Our data showed that tryptophan metabolism may also play an important role in mediating the central benefits of BL NC3001, as the probiotic increased the circulating plasma levels of both L-tryptophan (+8%) and N-acetylated-tryptophan (+18%). Although N-acetylated-tryptophan concentrations are more than double those of tryptophan, both metabolites are correlated with decreased amygdala reactivity and lower anxiety in patients with IBS. Tryptophan, a precursor of serotonin, mediates serotonergic activity in the brain and exerts beneficial effects on cognition, mood, and anxiety.<sup>36</sup> N-acetyl-tryptophan exerts a neuroprotective effect by blocking substance P-mediated neuroinflammation, reducing oxidative stress, exhibiting anti-apoptotic properties, and contributing to improved motor and cognitive functions in models of Parkinson's diseases.<sup>37,38</sup> Since plasma concentrations of these amino acids are strictly dependent on dietary sources, BL NCC3001-induced changes are indicative of a shift in protein and aromatic amino acid metabolism by the gut microbiota, a feature already revealed by the perturbation of 4-cresol sulfate metabolism described previously.<sup>16</sup>

The changes in plasma butyric acid and 2-methylbutyric acid induced by probiotics intervention are an additional indicator of a shift in protein and carbohydrate (including fibers and complex carbohydrates) metabolism by the gut microbiota. We found that the plasma

concentration of butyric acid was correlated with both the fecal abundance of BL NCC3001 and improvements in depression scores and amygdala reactivity. We hypothesize that BL NCC3001 increases butyric acid production by crossfeeding, as bifidobacteria are acetate producers that cross-feed butyric acid-producing colonic bacteria.<sup>39</sup> Butyric acid is known to reverse depressive behavior, increase serotonin concentration and BDNF expression, and restore blood-brain barrier impairments.<sup>8,40-42</sup> Furthermore, butyric acid contributes to dopamine and norepinephrine synthesis as well as dopaminergic function, by modulating tyrosine hydroxylase and dopamine-βhydroxylase genes.<sup>40</sup> In addition, butyric acidrelated changes in microbiota have been associated with changes in neuroinflammation through modulation of microglia activation, which may also contribute to the observed benefits.<sup>43</sup> However, none of the other Bifidobacterium spp previously tested in a mouse model improved anxiety-like behavior (WO2009127566). Therefore, in addition to the contribution of BL NCC3001 to a crossfeeding chain producing butyrate, other factors that are not conserved in all bifidobacteria may explain the observed specificity of the effect, such as the capacity of this strain to survive in the gastro-intestinal tract and/or the production of distinct metabolites (herein reported or undescribed).

Whilst this was the first randomized trial to show that BL NCC3001 fecal abundance and several plasma metabolites associated with the improvement of psychological comorbidities in IBS patients, there are some limitations that are important to emphasize. First, this was a pilot study with a limited number of participants, which included only IBS patients with diarrhea or mixed-stool phenotypes. Of note, we are currently conducting a confirmatory trial in a larger cohort of patients (NCT05054309), including those with IBS with constipation. This multicentric trial conducted in Canada will also offer the opportunity to validate our results based on a larger sample size. In terms of technical limitations, lipidome analysis would be required to enable a comprehensive study of all saturated and unsaturated fatty acids levels and their implications for depression disorders. Furthermore, the strain-specificity of the BL NCC3001 fecal abundance quantification method by qPCR is valid as long as there is no very closely related strain in the microbial environment, as discussed above. Noteworthy, we did not use a quantification assay that would distinguish live cells from dead cells.<sup>44</sup> A rapid calculation allows to show that the differences in the BL NCC3001 abundances measured in feces reflect the capacity of the probiotic to thrive in the gut (see supplementary discussion), and therefore the viability of the detected cells is not important in the current context.

In conclusion, improvement in psychological comorbidities and decreased brain emotional reactivity in non-constipated IBS patients was associated with an increased abundance of BL NCC3001 detected in feces and with several plasma metabolites, mainly butyric acid. These new findings suggest that the capacity of the probiotic BL NCC3001 to thrive in the gastrointestinal tract is an important requisite for its beneficial effects and that butyric acid may be a biochemical biomarker linking probiotic metabolism with its bioactivity.

### **Materials and methods**

### **Clinical study design**

We conducted a randomized, double-blind, placebo-controlled, single-center pilot study<sup>16</sup> in adult IBS patients with diarrhea or a mixed-stool pattern diagnosed based on the Rome III criteria.<sup>45</sup> The study was approved by the Hamilton Health Sciences and St Joseph's Health Care Research Ethics Boards, and all participants provided informed consent. This study was registered at ClinicalTrials.gov on January 13, 2011 (NCT01276626). These patients also exhibited mild-to-moderate anxiety and/or depression based on the Hospital Anxiety and Depression (HAD) scale<sup>46</sup> (HADA or HADD score 8–14).

This study included four hospital visits. At the screening visit, clinical history and symptoms were assessed, and physical examination and complete bloodwork were performed. At the second visit, the inclusion and exclusion criteria and symptoms were reassessed, and baseline stool, urine, and blood samples were collected. Psychological and intestinal symptoms were assessed using the

HADS and the Birmingham IBS questionnaires, respectively, and a functional magnetic resonance imaging (fMRI) study was conducted. Patients were randomized to either spray-dried BL NCC3001 (1x 10<sup>10</sup>CFU/1 gram powder with maltodextrin) or placebo containing 1 g of maltodextrin, to be taken daily at breakfast for a period of 6 weeks. The patients were asked not to change their eating habits or fiber intake. The study products were indistinguishable in terms of packaging, color, taste, and consistency. Compliance was measured by recording the participants' treatment intake, that is, the empty sachets were collected at the end of the intervention (the third visit). Symptom assessment, fMRI study, and samples collection were repeated at the third visit. Blood was collected in EDTA, and plasma was obtained by centrifugation. Finally, patients' symptoms were reassessed at a follow-up visit (4 weeks after treatment completion).

### **Clinical study endpoints**

The primary endpoint was a reduction in anxiety (HADA) and/or depression (HADD) scores of  $\geq 2$  points on the HAD scale<sup>45</sup> at the end of the treatment. These cutoffs were based on the previously established main clinically important differences for the anxiety and depression scores on the HAD scale of 1.3 and 1.4, respectively.<sup>47</sup> Secondary endpoints included, among others, improvement in anxiety and depression scores (HADA and HADD, continuous data), changes in brain activation patterns measured by fMRI, plasma metabolomics, and fecal BL NCC3001 counts.

#### Metabolomic analysis

Metabolomic analysis was conducted in plasma-EDTA samples collected before and at the end of the treatment to measure specific panels of bile acids and other host-gut microbial metabolites. Samples were extracted and prepared according to previously published methods.<sup>48,49</sup> All standards for bile acid analysis were obtained from Steraloids, Inc. (Newport, RI, USA) and TRC Chemicals (Toronto, ON, Canada). The calibration curve samples were prepared in a blank matrix and processed in the same manner as the real biological samples. An

ultra-performance liquid chromatography coupled to tandem mass spectrometry (UPLC-MS/MS) system (ACQUITY UPLC-Xevo TQ-S, Waters Corp., Milford, MA) was used to quantify bile acids in the human plasma samples based on previously published protocols.48,50 Data acquisition was performed using MassLynx version 4.1 and bile acid quantification was performed using the TargetLynx applications manager version 4.1 (Waters, Milford, MA, USA). For other host-gut microbial metabolite analyses, samples were analyzed using a previously published targeted host-microbial metabolic profiling method using gas-chromatography mass spectrometry (LECO, Saint Joseph, MI).<sup>49</sup> This second method enabled the quantification of 63 metabolites, including amino acids and derivatives, carboxylic acids, fatty acids, hydroxy acids, keto-acids, and aromatics.

#### Fecal BL NCC3001 abundance analysis

Fecal DNA was extracted using the QIAamp FAST DNA Stool Mini Kit (51604, Qiagen, Germany). DNA concentrations were measured using the PicoGreen fluorescence method (Thermo Fisher).

A chromosomal region spanning the insertion site of a mobile element was previously used to specifically detect the strain BL NCC3001.<sup>51,52</sup> A TaqMan MGB assay targeting this strainspecific region was designed (Primer Express 3.0, Applied Biosystems) to measure the abundance of the probiotic in fecal samples (BL NCC3001\_Fw 5'-GTGATAACCTCAACAACCGACAAC-3', BL NCC3001\_Pr (FAM) 5'- ATCTGCCCTTAAC GGC-3' (MGB), BL NCC3001\_Rev 5'- GCA TCACCTCGTTCTCGACAA-3'). The MasterMix LightCycler<sup>®</sup> 1536 DNA Green Master (05573092001, Roche) was used with a final concentration of 0.9 µM for each primer and 0.25 µM of the probe. Each data point was run in technical triplicate, and a standard curve was constructed in serial 10-fold dilutions of BL NCC3001 genomic DNA. The assay was performed on an LC480 II cycler (Roche) under the following PCR conditions: 7 min at 95°C for Taq activation, 10 s at 95°C for denaturation, and 30 s at 60°C for annealing and extension for 40 cycles, followed by cooling for 30 s at 40°C.

Another TaqMan MGB assay was used to normalize the abundance of BL NCC3001 relative to bacterial load.<sup>53</sup>

#### Statistical analysis

Chemometric analysis was performed on metabolomic data using the software package SIMCA-P+ (version 16.0, Sartorius Stedim Biotech, Sweden). Principal component analysis (PCA) and a modification of Partial Least Squares Regression (PLSR), which removes all information orthogonal to the response variable during the fitting process were employed. This variant, Orthogonal Projection to Latent Structures (O-PLS)<sup>54</sup> provides sparser models (improving their interpretability) with the same degree of fit as PLSR. Variable Importance in Projection (VIP) was used to highlight the weight of individual variables in the model, with a value above 1 used as a threshold by convention. Univariate analysis was conducted using unpaired and paired t-tests for group comparisons, and Spearman correlations between metabolites and HAD, amygdala endpoints, and bacterial counts were computed. Statistical analysis was performed using R 4.0.5 (2021-03-31). Data were visualized using the R packages ggplot2  $(2_{3.3.5})$  and ggpubr (0.4.0), particularly by applying their respective functions, ggboxplot, and ggscatter. Spearman correlation and Wilcoxon signed-rank exact tests were used to determine the significance levels between metabolites and fecal BL NCC3001 abundance after interventions and clinical endpoints.

#### Access to data

The authors will consider sharing anonymized participant data upon request directed to the corresponding author. The sponsor, investigators, and collaborators will review and approve the requests based on scientific rigor and ethical compliance of the proposal.

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