



Gut microbiome and cardiometabolic risk

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Abstract

The last decade has been characterized by an intense research on the composition of the gut microbiome and the links with human health. While previous work was focused on the effects of prebiotics and probiotics, nowadays several laboratories are describing the gut microbiome and its metabolic functions. Gut microbiome interaction with nutrients allows the gut microbiome to survive and at the same time determines the production of metabolites that are either adsorbed by intestinal cell in a mutual relationship or promote detrimental effect. Metabolomics, a new method to approach identification of biomarkers has been used to identify small metabolites in blood and other biofluids. The study of metabolome revealed several microbial derived metabolites that are circulating in blood and potentially affect human health. In this review we describe the links between regulation of metabolism and microbial derived metabolites.

Keywords Gut microbiome · Insulin resistance · Obesity · Diabetes · Atherosclerosis · Inflammation

1 The intestinal microbiome - a new player in cardiometabolic risk

In the past three decades life-style, especially energy imbalance due to high calorie food intake, has led to marked dearrangements in the metabolic pathways of lipid and carbohydrates and contributed to setting the stage for the onset and progression of metabolic and cardiovascular disorders [1]. Recently, it has been pointed out that the intestinal microbiome might contribute to the pathogenesis of metabolic and cardiovascular diseases as well as many other chronic disorders [2]. In this review, we expand previous discussion on how the microbial products and metabolites may affect human physiology [3–5].

While considered relevant for disease in the gut-liver system the role intestinal bacteria in cardiometabolic risk received little attention, but the research of the last decade has fundamentally changed this view. A human subject hosts an enormous amount of bacteria in different tissues such skin, lung and intestine. Due

to improved sequencing techniques more than than 22 million different microbial genes have been identified in the human gut, therefore largely exceeding the number of human genomes by a factor of almost 10^3 [6]. Thanks to this huge amount of genes it is clear that bacteria have metabolic functions more vast than the host, potentially contributing to the metabolism of the host organism through the generation of small metabolites, synthesis of essential amino acids and vitamins [7, 8]. Therefore, the intestinal microbiome is considered a tissue with wide metabolic potential with the ability to influence host metabolism thanks to the possibility to elaborate the nutrients contained in the diet and allow their components to be adsorbed and re-used by human cells (Figure 1).

The metabolic potential of the gut microbiome became clear after studies from Gordon's group presenting the connection between intestinal bacteria and metabolic diseases. In these studies, the intestinal bacterial flora from overweight mice was transplanted into germ-free recipient mice. Despite a constant diet, these mice developed obesity and insulin resistance suggesting that the obese phenotype, at least in part, is transferred by the microbiome [9]. A similar relationship emerged from studies of the microbiome structure in human monozygotic twins [10].

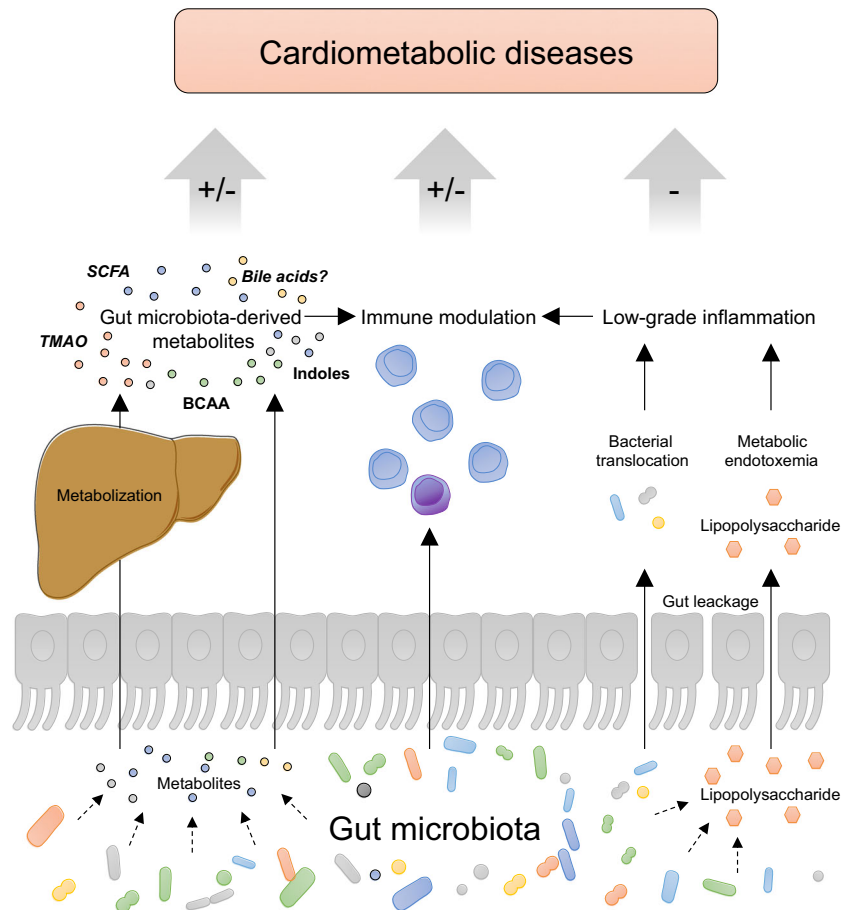
The architecture of the individual intestinal microbiome is variable and influenced by factors such as diet, genetic background, age, stress, physical exercise, coexistent disorders, use of antibiotics as well as other drugs such as metformin [11–14]. The term *dysbiosis* refers to a disproportion of certain

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Fig. 1 Gut microbiota-associated mechanism in cardiometabolic diseases including atherosclerosis, heart failure, diabetes, obesity and NAFLD. BCAA: branched-chain amino acids, SCFA: short chain fatty acids, TMAO: Trimethylaminoxide, “±” indicates either a positive or negative effect, “-“ indicates a negative effect on cardiometabolic diseases



components in the intestinal flora of a subject respect to physiology and it has been associated with metabolic diseases such as obesity, type 2 diabetes, non-alcoholic steatohepatitis [NASH] and cardiovascular diseases such as atherosclerosis and heart failure as well as many other chronic diseases [15, 16]

Actually, in both cardiovascular diseases and type 2 diabetes mellitus [T2DM] a change in Firmicutes/Bacteroidetes ratio has been detected; the causes of this alteration are still unclear although they maybe consequent to an interplay among dietary and other lifestyle habits resulting in an effect on obesity and insulin resistance depending from different metabolic functions in Firmicutes with respect to Bacteroidetes [15]. Intestinal bacterial species, such as *Roseburia intestinalis*, *Eubacterium halii* and *Faecalibacterium prausnitzii*, are generally decreased while *Lactobacilli gasserii*, *Streptococcus mutans* and *Escherichia coli* are increased in subjects with type 2 diabetes and CVD [3, 4]. It is known that gut-microbiota-based T2DM index might be used to identify subsets of the population that are at high risk for progressing to clinically defined T2DM [17, 18]. We and other groups have suggested that both intestinal dysbiosis and bacterial translocation are involved in the development of cardiometabolic disorders such as type 2 diabetes,

non-alcoholic fatty liver disease (NAFLD) and atherosclerosis [17, 19–24]. Patients with obesity, insulin resistance and steatosis show signs of reduced microbial gene richness and increased genetic potential for processing of dietary lipids and endotoxin biosynthesis [notably from *Proteobacteria*], hepatic inflammation and dysregulation of aromatic and branched-chain amino acid [AAA and BCAA] metabolism [25]. In patients with symptomatic atherosclerosis, the genus *Collinsella* was enriched whereas *Roseburia* and *Eubacterium* were enriched in healthy controls [26].

2 Gut microbiome-associated mechanisms in cardiovascular diseases

Due to the close association between the intestinal microbiome and cardiometabolic diseases, the issue arises whether a dysbiotic gut microbiome, through activation of specific functions or loss of other activities, may swift cardiovascular risk factors such as diabetes, hypertension and dyslipidemia thus contributing to the onset and the progression of atherosclerosis [27].

There are several mechanisms that have been proposed to explain how intestinal bacteria could influence cardiometabolic diseases.

Dysbiosis could prompt an inflammatory status in the intestine that result in the production and absorption of factors triggering *low-grade* inflammation such as lipopolysaccharides (LPS) [28]. In particular, *low-grade* inflammation in the adipose tissue may pave the onset for insulin resistance [29].

Since several studies underlined that in cardiovascular diseases the immune system has a role, it is conceivable that deviation in the integrity of the immunomodulatory functions of the gut microbiome may determine inflammation [30]. For instance it is known that interleukin-23-22 axis regulates diet-induced atherosclerosis by repressing pro-atherogenic microbiota. Loss of IL-23-IL-22 signaling causes a deterioration of the intestinal barrier, dysbiosis, and expansion of pathogenic bacteria with distinct biosynthetic and metabolic properties, causing systemic increase in pro-atherogenic metabolites such as LPS [31]. This study perfectly emphasizes mechanisms explaining the pro-atherogenic effect of dysbiosis.

Segmented filamentous gut bacteria have been shown to regulate Th17 cells, which are able to produce IL-22, but depending on the circumstances also the pro-inflammatory cytokine IL-17 [32]. Gut microbiota-facilitated Th17/IL-17 response has been linked to vascular inflammation as well as salt-sensitive hypertension [33, 34].

However, which factors instigate the divergence from a physiological microbiome to a dysbiotic one linked to immunomodulation is still debated [35].

Another mechanism is intrinsic to gut microbiome functions and its metabolic activity. The gut microbiome produces several metabolites as the result of its interaction with nutrients. Once these are adsorbed by the intestine wall they can enter the circulation and exert a direct influence on the host phenotype [8].

The massive number of enzymatic pathways that constitute the core of bacteria metabolism is a feature of the diversity of the gut microbiome allowing the symbiont to take advantage to adsorb substances that otherwise could be neither produced nor extracted from the digestive process [36].

Thanks to the improvement in analytical methods for small metabolites (metabolomics) we now appreciate that thousands of molecules are potentially detectable in the blood [37]. Recent analysis suggested that many of these metabolites have their source in the metabolism of intestinal bacteria. Nutrients enter the intestine, where they are metabolized by various bacteria and absorbed into the circulation. Some of these metabolites are moreover modified or conjugated in the liver, resulting in microbiome-host co-metabolites [8]. Microbial metabolites or co-metabolites can in turn achieve numerous pleiotropic effects, for example via specific receptors, as has already been described for short-chain fatty acids, indoles or secondary bile acids [38].

3 Cardiometabolic inflammation by endotoxemia

Bacterial endotoxins, so-called lipopolysaccharides [LPS], are structurally conserved components of cell membranes of gram-negative bacteria [39]. As such, they activated the innate immune system and trigger an inflammatory reaction in picomolar concentrations [40, 41]. A gram-negative sepsis leads to a dramatic increase in LPS concentrations. On the contrary, the concept of “metabolic endotoxemia” was coined to refer to slightly elevated LPS levels in the blood without a manifest infection [28]. Numerous studies show that serum measured LPS levels correlate with the incidence or prevalence of cardiovascular disease [40–44]. The hypothesis that endotoxins are among the causal mediators of these diseases is supported by the observation that experimentally induced *low-grade* endotoxemia accelerates the development of atherosclerosis in rodents [45, 46]. The *toll-like receptor* (TLR) 4 acts as a receptor for LPS. Accordingly, TLR4-deficient mice are more resistant to atherosclerotic vascular disease [47, 48].

A question arises what the source of circulating endotoxin in the absence of infection is. One hypothesis, supported by experimental data, suggest that LPS translocates from the intestinal lumen, where it is either produced by intestinal bacteria or ingested through food, into the circulation [28]. Metabolic endotoxemia can be promoted by dietary fat intake chylomicron-mediated [49, 50] and is elevated postprandially in both rodents and humans [28, 51]. Since levels of endotoxins in the intestinal lumen are massively elevated in relation to the serum, intestinal permeability seems to play a decisive role. For example, elevated levels of LPS could be detected in the blood of patients with acutely decompensated heart failure and consequently intestinal edema with impaired permeability [52]. The gut microbial flora is also able to regulate intestinal permeability. It could be shown that intestinal bacteria regulate intestinal permeability via a GLP-2-dependent mechanism and thus influence systemic *low-grade* inflammation [53].

4 Bacterial translocation from the gut into the host tissues

In addition to endotoxemia, increased intestinal permeability may also lead to translocation of bacteria into blood and tissue, maintaining chronic *low-grade* inflammation [20, 54]. Burcelin and coworkers showed in mice fed a high-fat diet and showing insulin resistance, a large number of DNA of Gram-negative bacteria were detected in blood and fatty tissue. Probiotic treatment with a *Bifidobacterium strain* could improve both translocation and systemic inflammation and insulin resistance [55].

The same group also investigated bacterial DNA in the blood of 3936 participants with a cardiovascular risk profile. In a multivariate model, bacterial DNA from *Proteobacteria* was shown to be a sign of dysbiosis predictive for cardiovascular [56].

5 Metabolites with direct evidence to affect cardiovascular diseases

Gut microbiota produces numerous metabolites, some of which are absorbed into the systemic circulation and are biologically active, whereas others are further metabolized by host enzymes, and then serve as a mediator of microbial influence on the host. Particularly, these metabolites may favour an inflammatory status, and then to be associated to the pathogenesis of acute coronary syndrome [ACS], and involved in atherosclerosis onset and progression [57].

5.1 Trimethylamine oxide

The Hazen group was able to demonstrate the importance of the gut flora-dependent metabolite *trimethylamine oxide* (TMAO) in the development of atherosclerosis, thrombosis and ischemic heart failure [57–61]. Food-supplied phosphatidylcholine, a component of red meat, is converted by intestinal bacteria to trimethylamine, which is metabolized in the liver via the enzyme flavin-containing monooxygenase 3 (FMO3) to TMAO [57]. TMAO is therefore a microbiome-host co-metabolite. The mechanism underlying TMAO effects are still under investigation. However, it has been pointed out that dietary supplementation of mice with choline or TMAO promoted upregulation of multiple macrophage scavenger receptors linked to atherosclerosis, and supplementation with TMAO promoted atherosclerosis [60]. TMAO is also considered to influence the reverse cholesterol transport (RCT) in macrophages as suggested from studies with FMO3 knockdown mice, in which basal and liver X receptor (LXR)-stimulated macrophage RCT is increased leading to improved cholesterol balance [61]. TMAO, directly contribute to platelet hyperreactivity and enhanced thrombosis potential via enhanced sub-maximal stimulus-dependent platelet activation from multiple agonists through augmented Ca²⁺ release from intracellular stores [62]. Interestingly, 3,3-dimethyl-1-butanol (DMB, a structural analog of choline) was shown to inhibit TMA formation and inhibited endogenous macrophage foam cell formation and atherosclerotic lesion development in experimental models without alterations in circulating cholesterol levels [63]. Overall, we may comment that the TMAO through effects on lipid metabolism, platelet and immune functions deteriorates cardiovascular health.

5.2 Short chain fatty acids

Short chain fatty acids (SCFA) such as butyrate, acetate and propionate are known to affect several human diseases [38]. SCFA are the prototypical examples of the holobiont metabolism. In fact, starch and non-starch polysaccharides that cannot be degraded by human enzymes are broken down to SCFA by various bacterial species such as *Roseburia* species and *Faecalibacterium prausnitzii* thanks to primary bacterial butyrate synthesis pathways, butyryl-CoA:acetate CoA-transferase (but) and butyratekinase (buk) [64]. SCFA mediate some of their effects via G protein coupled receptors (GPR41 and GPR43) and play a role in the regulation of immune cells, the release of cytokines, and the expression of adhesion molecules in vascular cells. These in turn are all processes that are directly related to cardiovascular diseases [65].

A recent paper suggested that *Roseburia intestinalis* cooperates with dietary plant polysaccharides to produce butyrate. This interaction has an impact on gene expression in the gut, exerts modulatory effects on metabolism shifting it from glycolysis to fatty acid utilization (an effect often associated to anti-inflammatory cytokines and lower systemic inflammation) and finally ameliorate atherosclerosis in experimental models [66].

Interestingly, in hypertensive mice a diet rich in fiber improved blood pressure control as well as heart failure progression in part through acetate. Acetate was shown to reduce the burden of fibrosis in heart and kidney acting on the transcription factor Egr1 [67].

5.3 Branched chain amino acids

Branched-chain amino acids (BCAA) metabolism is in part dependent on the intestinal flora. Bacteria have a wide range of enzymatic functions to trigger BCAA biosynthesis and BCAA are also adsorbed to enter the human circulation. In the host BCAA catabolism is especially active in adipose and hepatic tissues. A recent analysis in non-diabetic subjects showed that elevated BCAA levels and insulin resistance were associated with a gut microbiome characterized by increased biosynthesis of BCAA and reduced bacterial inward transporters for these amino acids, suggesting increased production and availability for absorbance by intestinal wall. This effect was primarily mediated by *Prevotellacopri* and *Bacteroides vulgatus*. In the mouse model, treatment with *Prevotella copri* increased serum levels of BCAA and led to insulin resistance [68]. Although circulating BCAAs come from nutrients and microbial metabolism, it is unclear how they induce insulin resistance despite the strong evidence that BCAA are predictive for the development of type 2 diabetes as shown in the Framingham Heart Study and other cohorts [69]. A potential mechanism recently described suggests that 3-hydroxyisobutyrate (3-HIB), a catabolic intermediate of the

BCAA valine, is a new paracrine regulator of trans-endothelial fatty acid transport. Arany and coworkers found in mice that 3-HIB after being secreted from muscle cells stimulates muscle fatty acid uptake *in vivo*. As consequence of this, it promotes lipid accumulation in the muscle leading eventually to insulin resistance [70]. It is unclear whether the same mechanism is active in the myocardium. However, increased BCAA levels also correlate with the incidence of cardiovascular disease [71].

5.4 Microbial metabolites derived from aromatic amino acids

A recent study in obese women revealed that a disturbed aromatic amino acid (AAA) metabolism was associated with intestinal dysbiosis and hepatic steatosis. This effect was in part mediated by phenylacetate (PAA), an intestinal flora-dependent metabolite from the AAA metabolism. PAA was shown to affect insulin-mediated Akt phosphorylation in human primary hepatocytes and this effect can possibly also be transferred to other cardiometabolic diseases [25]. The microbial source of PAA is still undefined but a recent study observed that was negatively associated with the *Bacteroides* group and *Clostridium cluster XIVa* and positively with *Lactobacillus* [72]. Whether these microbes possess the oxidative pathway required to transform phenylalanine in PAA is unclear.

Clostridium sporogenes may be the source of another microbial metabolite derived from the AAA tryptophan with a potential effect on cardiovascular health: indole-3 propionic acid (IPA) produced exclusively by the microbiota from dietary tryptophan that accumulates in host serum [73]. Recent studies have shown that IPA can exert anti-inflammatory effects by directly engaging the pregnane X receptor (PXR) [74]. Interestingly, IPA was found negatively associated with type 2 diabetes, low-grade inflammation and advanced atherosclerosis [75, 76, 77].

Recently, it was shown that *Lactobacillus* species were able to modulate Th17 response and to protect against salt-sensitive hypertension. This effect was mediated by another gut microbiota-derived tryptophan metabolite, indole-3-acetic acid (IAA), which dose dependently reduced Th17 polarization [34]. IAA has previously been identified as a ligand of aryl hydrocarbon receptor exerting positive effects on inflammation by modulation of IL-22 response [78]. An imbalance between gut microbiota-derived tryptophan metabolites (“indoles”) and endogenous tryptophan derivatives (kynurenine pathway) may play an important role in cardiometabolic disease modulation. The human enzyme indoleamine 2,3-dioxygenase, which is inducible in several different immune cells, is the rate-limiting first step in tryptophan degradation via kynurenine pathway [79]. High activity has been linked to cardiovascular events

[80]. Laurans and colleagues revealed that an obese phenotype induces indoleamine 2,3-dioxygenase and consequently diminishes IL-22 response by bacterial tryptophan derivatives with impact on insulin sensitivity, gut mucosal barrier and inflammation as well as lipid metabolism [79].

Other microbial AAA-derived host co-metabolites such as phenylpropionic, indoxyl sulfate (IS) and p-cresyl sulfate (PCS) may exert negative functions in particular increasing the cardio-metabolic risk in subjects with kidney failure [81, 82]. In fact, both IS and PCS are protein-bound uremic toxins that increase in the sera of patients with chronic kidney disease (CKD), and are not effectively removed by dialysis. Some studies suggested that both elevated levels of PCS and IS are associated with increased mortality in patients with CKD, while PCS, but not IS, is associated with an increased risk of cardiovascular events [82]. Both metabolites promote vascular calcification and associate with glucose intolerance through mechanisms involving LXR signaling pathway and reduced GLUT1 expression [83].

5.5 Other amino acid derived metabolites

Recently, a study based on the Lifelines DEEP cohort identified bacterial L-methionine biosynthesis and a *Ruminococcus* species were associated to cardiovascular phenotypes in obese individuals, in particular atherosclerosis and liver fat content. This study also found that several microbial pathways involved in amino acid metabolism are associated with metabolic risk score of cardiovascular disease independent of diet and inflammation [84].

5.6 Bile acids

Primary bile acids arise from the oxidation of cholesterol in the liver and are excreted into the gut to make lipids soluble for absorption. There they are deconjugated by microbial bile salt hydrolase, mainly from *Bifidobacteria*, *Clostridia* and *Bacteroidetes*, to secondary bile acids, which are reabsorbed into the circulation [85]. Secondary bile acids can achieve various pleiotropic effects via the farnesoid X (FXR) receptor and the Takeda G protein-coupled receptor 5 (TGR5). Their activation leads to transcriptional inhibition of pro-inflammatory cytokines, regulation of GLP-1 secretion in L-cells, glucose-dependent insulin secretion in the pancreas, influence on hepatic lipoprotein and glucose metabolism and control of bile acid synthesis and secretion in the liver via the FXR-*fibroblast growth factor* 15/19 signaling pathway [86]. However, a direct mechanism of these metabolites on atherosclerosis onset and progression is still unclear. Nevertheless, INT-767, a specific co-agonist for both FXR and TGR5 bile acid receptors could reduce atherosclerosis in the mouse model [87]. Furthermore, a recent analysis showed that 2 circulating secondary bile acids (glycocholate and glycolithocolate sulfate) associated with atrial fibrillation

(AF) risk [88]. Another study found increased levels of secondary bile acids in patients with heart failure [89].

6 Conclusions

The intestinal microbiome is an essential factor in human health and is closely linked to physiological and pathological processes that go far beyond local processes in the intestine. Cardiometabolic diseases in particular appear to be closely linked to the metabolic pathways triggered by the interaction of nutrients with the intestinal flora. Several potential targets for diagnostic or therapeutic use have been identified including microbial species and their metabolic products. However, we should be cautious in the translation of experimental data to clinical practice given that our knowledge of which bacteria are involved and which metabolic pathways is still incomplete. It is conceivable that in few years the scenario linking gut microbiota to microbial metabolites will be completed and potential applications will enter the clinical practice.

In fact, despite promising data, probiotic therapy and fecal matter transplantation remain limited at the moment to very specific applications and in the cardiometabolic field we are still at the level of experimental approaches. A specific therapy for the modulation of the intestinal microbiome in cardiometabolic diseases must therefore still be established and above all subsequently validated in large patient cohorts.

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Compliance with ethical standards

Conflict of interest M.F. is co-inventor on pending patents held by INSERM Transfert, INSERM, University of Rome Tor Vergata, University of Girona and Imperial College on NAFLD diagnostics and has the right to receive royalty payments for inventions or discoveries related to NAFLD diagnostics.

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