

UNIVERSIDADE SÃO FRANCISCO  
Programa de Pós-Graduação *Stricto Sensu* em Ciências da Saúde

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**EFEITO COMBINADO ENTRE O ÍNDICE DE MASSA  
CORPORAL E O NÍVEL DE ATIVIDADE FÍSICA SOBRE  
METABÓLITOS PLASMÁTICOS**

Bragança Paulista  
2024

**MAYARA LAMBERT – R.A. 001202010046**

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CORPORAL E O NÍVEL DE ATIVIDADE FÍSICA SOBRE  
METABÓLITOS PLASMÁTICOS**

Tese apresentada ao Programa de Pós-Graduação *Stricto Sensu* em Ciências da Saúde da Universidade São Francisco, como requisito parcial para obtenção do Título de Doutora em Ciências da Saúde.

Área de Concentração: Ciências da Saúde – Farmacologia Clínica e Geral

Orientador: Prof. Dr. Ivan Gustavo Masselli Dos Reis

Bragança Paulista

2024

## FICHA CATALOGRÁFICA

QU 120  
L223e

Lambert, Mayara

Efeito combinado entre o índice de massa corporal e o nível de atividade física sobre metabólitos plasmáticos / Mayara Lambert. -- Bragança Paulista, 2024.

56 p.

Tese (Doutorado) – Programa de Pós-Graduação  
*Stricto Sensu* em Ciências da Saúde da Universidade

1. Metabolômica. 2. Índice de massa corporal. 3. Exercício físico. 4. Obesidade. I. Reis, Ivan Gustavo Masselli dos. II. Título.

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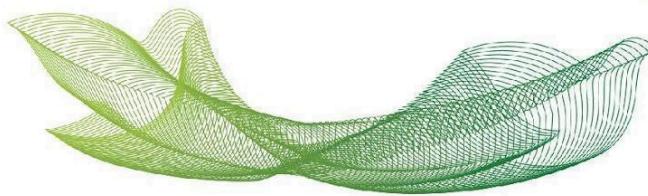
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**Educando  
para a paz**

**LAMBERT, Mayara.** "Efeito combinado entre o índice de massa corporal e o nível de atividade física sobre metabólitos plasmáticos". Tese defendida e aprovada no programa de Pós-Graduação *Stricto Sensu* em Ciências da Saúde da Universidade São Francisco em 28 de novembro de 2024 pela Banca examinadora constituída pelos membros:

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## **AGRADECIMENTOS**

Ao meu amado pai, minha eterna saudade, que me apoiou no início desta jornada. À minha mãe, minha irmã e meu namorado pelo incentivo, suporte e por acreditar que eu poderia chegar até aqui. E à Betina e ao Bento, meus cãopanheiros amados e inseparáveis.

A todos os meus familiares e amigos pelo carinho durante todo esse processo.

Ao meu orientador Prof. Dr. Ivan, pela confiança, orientação e auxílio na realização deste projeto. Muito obrigada, professor por ser tão dedicado e inspirador nesta jornada.

A todos professores e colegas do Programa de Pós-Graduação Stricto Sensu em Ciências da Saúde da Universidade São Francisco, e principalmente, a todos os colaboradores do presente trabalho: Larissa Pedroso, Álex Rosini, Pedro Paulo Scariot, Prof. Dr. Leonardo Messias, Prof<sup>a</sup>. Dr<sup>a</sup>. Andréia Porcari e Prof<sup>a</sup>. Dr<sup>a</sup>. Patricia de Oliveira Carvalho.

Aos membros desta comissão examinadora, pela revisão e contribuições sobre o trabalho.

O presente trabalho foi realizado com apoio da Coordenação de Aperfeiçoamento de Pessoal de Nível Superior - Brasil (CAPES) – Processo número 88887.901860/2023-00.

## RESUMO

A obesidade é um dos problemas de saúde de maior gravidade que enfrentamos atualmente, sendo esta comorbidade diretamente relacionada a altos níveis plasmáticos de diglicerídeos, triglicerídeos e ácidos graxos livres, conjuntamente com alterações metabólicas, sendo que, quanto maior o grau de obesidade do indivíduo, maior a probabilidade e/ou risco do mesmo desenvolver determinadas doenças. A esportômica é a ciência responsável por investigar e correlacionar a resposta do metabolismo biológico à diferentes situações e condições físicas. Apesar de pouco se saber a respeito do impacto das alterações dos níveis plasmáticos de fosfolipídeos em resposta ao estresse oxidativo em indivíduos obesos, tem-se que a prática de atividades físicas regularmente pode promover a adaptação e melhorar a capacidade das células em lidar com o estresse oxidativo da homeostase. Sendo assim, após a aprovação do Conselho em Ética em Pesquisa (CEP) com parecer de número 3.601.407, o presente estudo correlativo e exploratório teve como objetivo avaliar de forma abrangente os perfis de metabólitos plasmáticos usando uma abordagem metabolômica não direcionada (*untargeted*) de indivíduos com Índice de Massa Corporal (IMC) eutróficos ( $n = 20$ , IMC = 22,3) ou com sobrepeso/obesidade ( $n = 29$ , IMC = 29) *versus* diferentes níveis de atividade física auto-reportados, avaliados através do Questionário Internacional de Atividade Física (IPAQ), nível baixo ( $n = 33$ , IPAQ = 842) ou alto ( $n = 16$ , IPAQ = 6935). As amostras de plasma dos participantes foram analisadas por meio de técnica de Cromatografia Líquida acoplada à Espectrometria de Massas (LC-MS/MS) e, os 64 metabólitos principais obtidos foram avaliados por meio da análise de variância bidirecional para a determinação da variância dos dados entre os diferentes grupos. Por fim, aplicou-se uma abordagem por rede complexa para os principais metabólitos e foi calculada a centralidade do autovetor para revelar aqueles mais relevantes. A maioria das alterações detectadas no estudo foram atribuíveis ao IMC, embora também tenha sido observado algum efeito dos níveis de atividade física auto referidos. A maioria dos metabólitos relevantes foram espécies oxidadas de fosfolipídios. Grande parte das espécies de fosfatidilcolina e uma espécie de fosfatidilglicerol foram encontradas diminuídas em indivíduos obesos, enquanto a maioria das espécies de fosfatidiletanolamina, fosfatidilserina e fosfatidil-inositol foram aumentadas. Apenas uma única espécie de prostaglandina, fosfatidilglicerol e fosfatidilinositol foi modulada pelo IPAQ, mas efeitos de interação entre IMC e IPAQ foram encontrados para a maioria dos metabólitos na combinação de IMC obeso com IPAQ baixo, concluindo que a modulação dos fosfolipídios oxidados no plasma pela obesidade foi acentuada pelos baixos níveis de atividade física.

**Palavras-chave:** Metabolômica. Índice de massa corporal. Exercício físico. Obesidade.

## ABSTRACT

Obesity is one of the most serious health problems we face today, and this comorbidity is directly related to high plasma levels of diglycerides, triglycerides, and free fatty acids, together with metabolic alterations, and the higher the degree of obesity of the individual, the greater the probability and/or risk of developing certain diseases. Sportomics is the science responsible for investigating and correlating the response of biological metabolism to different situations and physical conditions. Although little is known about the impact of changes in plasma phospholipid levels in response to oxidative stress in obese individuals, it is believed that regular physical activity can promote adaptation and improve the ability of cells to deal with oxidative stress from homeostasis. Thus, after approval by the Research Ethics Council (CEP) with opinion number 3,601,407, the present correlative and exploratory study aimed to comprehensively evaluate the plasma metabolite profiles using an untargeted metabolomic approach of individuals with Body Mass Index (BMI) eutrophic ( $n = 20$ , BMI = 22.3) or overweight/obese ( $n = 29$ , BMI = 29) versus different self-reported physical activity levels, assessed using the International Physical Activity Questionnaire (IPAQ), low ( $n = 33$ , IPAQ = 842) or high ( $n = 16$ , IPAQ = 6935) level. The plasma samples of the participants were analyzed using the Liquid Chromatography technique coupled to Mass Spectrometry (LC-MS/MS), and the 64 main metabolites obtained were evaluated through bidirectional analysis of variance to determine the variance of the data between the different groups. Finally, a complex network approach was applied to the main metabolites and the centrality of the eigenvector was calculated to reveal the most relevant ones. Most of the changes detected in the study were attributable to BMI, although some effect of self-reported physical activity levels was also observed. Most of the relevant metabolites were oxidized phospholipid species. Most of the phosphatidylcholine species and one species of phosphatidylglycerol were found to be decreased in obese individuals, while most of the phosphatidylethanolamine, phosphatidylserine, and phosphatidylinositol species were increased. Only a single species of prostaglandin, phosphatidylglycerol, and phosphatidylinositol were modulated by IPAQ, but interaction effects between BMI and IPAQ were found for most metabolites in the combination of obese BMI and low IPAQ, concluding that the modulation of oxidized phospholipids in plasma by obesity was accentuated by low BMI. Only a single species of prostaglandin, phosphatidylglycerol, and phosphatidylinositol were modulated by IPAQ, but interaction effects between BMI and IPAQ were found for most metabolites in the combination of obese BMI and low IPAQ, concluding that the modulation of oxidized phospholipids in plasma by obesity was accentuated by low levels of physical activity.

**Keywords:** *Metabolomics. Body mass index. Physical exercise. Obesity.*

## **LISTA DE SÍMBOLOS E ABREVIAÇÕES**

ABESO – Associação Brasileira para o Estudo da Obesidade e Síndrome Metabólica

CEP – Comitê de Ética em Pesquisa

IMC – Índice de Massa Corporal

IPAQ – Questionário Internacional de Atividade Física

LC – *Liquid Chromatography* (Cromatografia Líquida)

MS – *Mass Spectrometry* (Espectrômetro de Massas)

OMS – Organização Mundial de Saúde

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## 1 INTRODUÇÃO

### 1.1 Obesidade

Segundo a Associação Brasileira para o Estudo da Obesidade e Síndrome Metabólica (ABESO, 2024), a obesidade é um dos problemas de saúde de maior gravidade que encontramos atualmente no mundo, estimando-se que em 2025 em torno de 2,3 bilhões de adultos estarão acima do peso com Índice de Massa Corporal (IMC) maior ou igual a 25, sendo que destes, 700 milhões de indivíduos irão apresentar obesidade (com IMC maior ou igual a 30). Já para a população brasileira cerca de 55,4% apresenta atualmente excesso de peso e, 19,8% apresenta obesidade. Ainda, a projeção nacional para daqui há 10 anos será a de que, no Brasil, quase 140 milhões de adultos tenham excesso de peso, quadro este, extremamente alarmante para a saúde da população (ABESO, 2024; WOF, 2024).

A obesidade é diretamente relacionada a altos níveis plasmáticos de diglicerídeos, triglicerídeos e ácidos graxos livres, conjuntamente com alterações metabólicas, que comumente são incidentes em indivíduos com esta condição (TONKS et al., 2016; MOORE et al., 2014). Tem-se que, quanto maior o grau de obesidade do indivíduo, maior a probabilidade e/ou o risco de o mesmo desenvolver determinadas doenças (ANJOS, 1992; OLIVEIRA et al., 2012). Entretanto, a ocorrência da obesidade em um indivíduo se dá de maneira multifatorial, ou seja, têm-se mecanismos endógenos como responsáveis pelo desenvolvimento desta condição, por exemplo, por meio de fatores genéticos ou ainda, por meio de fatores exógenos como por exemplo, o ambiente ou e até mesmo o status socioeconômico do indivíduo (THAKER, 2017; STURM; AN, 2014).

A diminuição de riscos de doenças associadas à prática de exercícios físicos é uma questão já amplamente relatada e disseminada por pesquisas científicas, auxiliando diretamente na prevenção ou retardamento da obesidade além de a prática de ser capaz de modular metabólitos endógenos (ELAGIZI et al., 2020; BONGIOVANNI et. al., 2019; TIAN et. al., 2021).

### 1.1.1 Índice de Massa Corpórea (IMC)

O IMC, possibilita aferir a partir dos dados antropométricos de um indivíduo qual a condição nutricional do mesmo, sendo facilmente calculado a partir da razão entre o peso corporal em quilos e a altura ao quadrado do indivíduo. Este indicador é mundialmente consolidado e, através dele é possível se estabelecer o range da condição nutricional do ser humano, sendo os indivíduos eutróficos os que apresentam IMC entre 18 e 25, com sobre peso àqueles que apresentam  $\text{IMC} \geq 25$  e obesos àqueles que possuem  $\text{IMC} \geq 30$ .

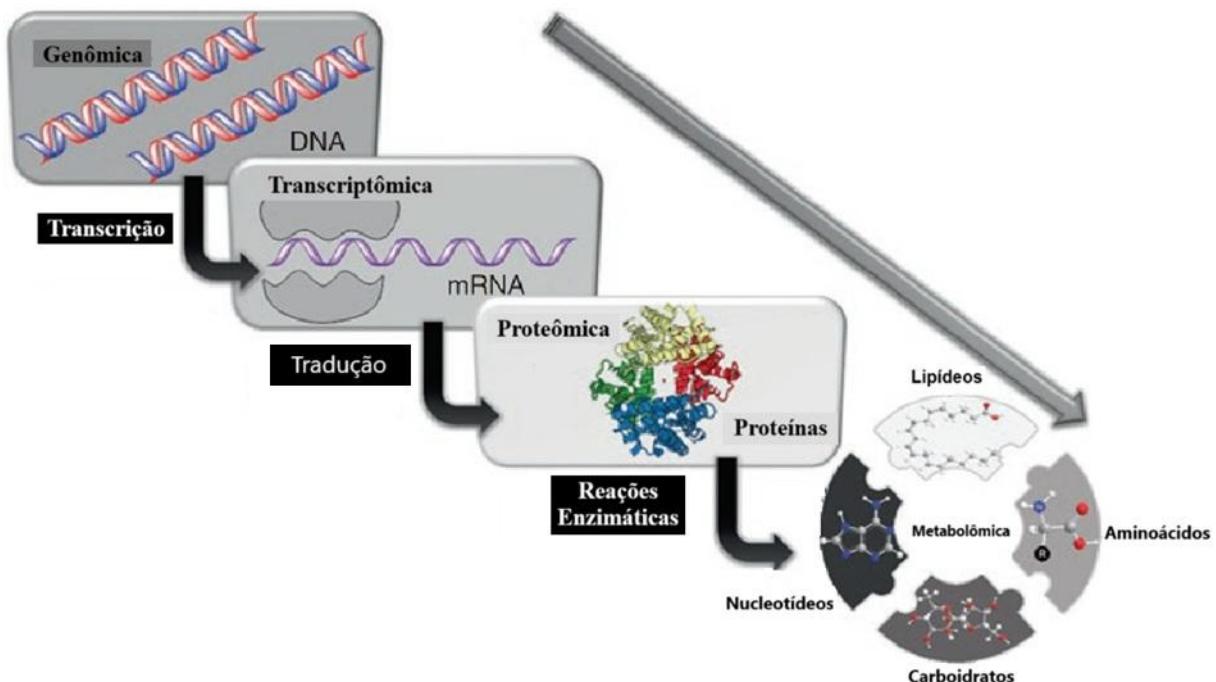
### 1.1.2 Questionário Internacional de Atividades Físicas (IPAQ)

O Questionário Internacional de Atividade Física (IPAQ), foi proposto pela Organização Mundial de Saúde (OMS) em 1998, a fim de servir como uma ferramenta mundial para a determinação do nível de atividade física de um indivíduo (MATSUDO et al., 2012). Deste modo, com o objetivo de elaborar uma ferramenta de fácil acesso e aplicabilidade para a avaliação dos níveis de atividade física praticados pela população, foi criado por agências normativas o Questionário Internacional de Atividades Físicas (IPAQ). Este questionário permite a categorização do nível de atividade física do indivíduo, através da avaliação da frequência, duração e intensidade do exercício, permitindo deste modo, uma determinação individualizada do grau de necessidade e acompanhamento em programas de exercícios físicos (VESPASIANO; DIAS; CORREA, 2012). Um modelo do IPAQ pode ser verificado no Anexo II do presente trabalho.

## 1.2 Metabolômica

As ciências “ônicas” consistem no estudo de diferentes moléculas endógenas em diversas abordagens distintas. Dentre as principais áreas “ônicas” tem-se a genômica que realiza o estudo do DNA, a transcriptômica para a análise das moléculas transcritas de mRNA, a proteômica que

analisa as proteínas e a metabolômica, que avalia metabólitos de um sistema, conforme exemplo demonstrado na Figura 1 (BEDIA, 2018).



**FIGURA 1. Principais abordagens “ômicas”.** Fonte: figura adaptada de SUSSULINI, 2017.

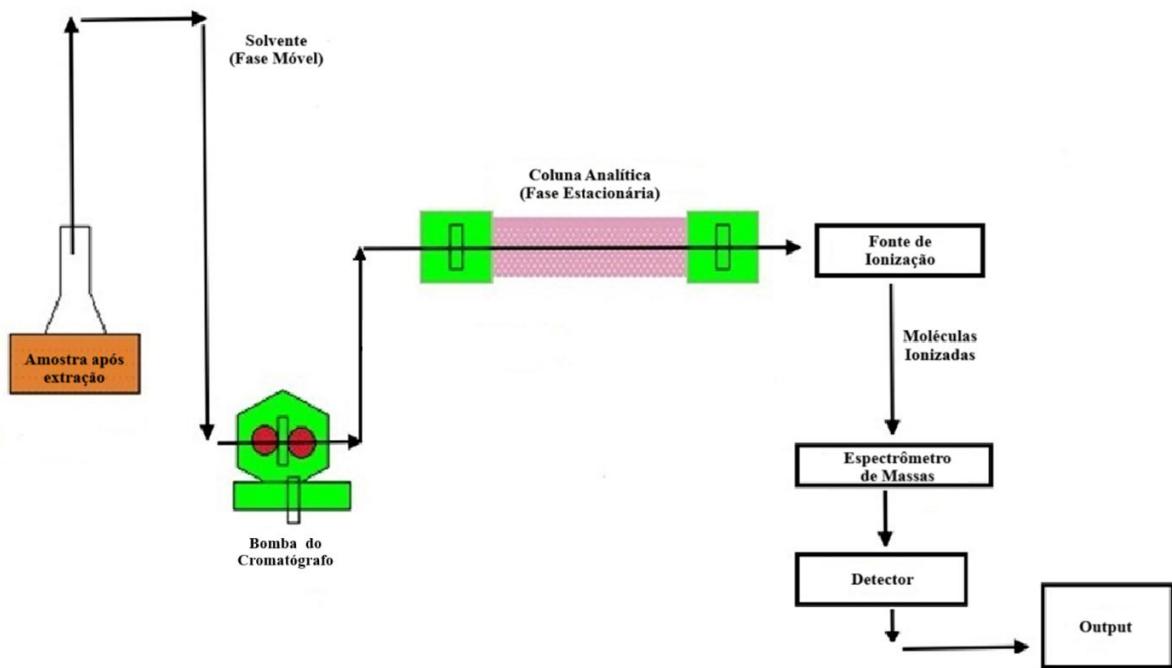
A metabolômica é a ciência que estuda pequenas moléculas com peso molar de até 1500 Da em amostras biológicas e, a avaliação dessas moléculas pode ser utilizada com a finalidade de evidenciar tanto diferentes processos celulares quanto suas funções metabólicas (KUEHNBAUM; BRITZ-MCKIBBIN, 2013). De maneira geral, a metabolômica é subdividida em duas abordagens de análise dos achados, a análise direcionada (*targeted*) que avalia um único metabólito ou um grupo específico de metabólitos e, a análise não direcionada (*untargeted*) que realiza uma avaliação sem um alvo específico de todo o metaboloma do organismo (CANUTO et al., 2018).

### 1.2.1 Esportômica

Levando em consideração um contexto da Ciência do Esporte, a análise de metabólitos séricos pela abordagem metabolômica, possui considerável reconhecimento, inclusive, consolidando em âmbito científico tal abordagem como “Esportômica”, sendo esta uma abordagem holística com foco no indivíduo, de maneira semelhante à metabolômica, entretanto, com uma abordagem nos esportes como o desafio metabólico (WIDMANN et al., 2019). Avanços analíticos em tecnologias laboratoriais têm permitido que a ciência esportiva e a saúde humana se desenvolvam amplamente, isto porque, cascatas intracelulares vêm sido demonstradas, sobretudo, através da interpretação de respostas específicas aos estímulos desenvolvidos por meio da prática de atividades físicas (BARTLETT et al., 2014; BARR, 2014).

## 1.3 Cromatografia Líquida acoplada à Espectrometria de Massas (LC-MS/MS)

De maneira geral, um Cromatógrafo Líquido (*Liquid Chromatography – LC*) é responsável por realizar a separação de misturas. Ele consiste em um sistema de bombas que empurra os distintos analitos através de um solvente de arraste (fase móvel), responsável por dissolver e carregar os analitos que têm afinidade com ela, além de uma coluna analítica (fase estacionária) que pode ser recheada com micropartículas de diversas composições diferentes, possibilitando assim, a separação dos compostos (HARRIS, et al., 2005). Já o Espectrômetro de Massas (*Mass Spectrometry – MS*) consiste em um tipo de detector que, acoplado à um LC consistem em uma técnica de separação e detecção que possibilita a determinação de moléculas por meio da razão massa/carga ( $m/z$ ) após a ionização das mesmas, sendo no geral, altamente sensível e seletivo para a identificação de analitos (SKOOG et al., 2001). Um exemplo desses módulos acoplados encontra-se na Figura 2 adiante.



**FIGURA 2. Esquema de cromatografia líquida acoplada à espetrômetro de massas (LC-MS).**

Fonte: figura adaptada de SHARMA, 2023.

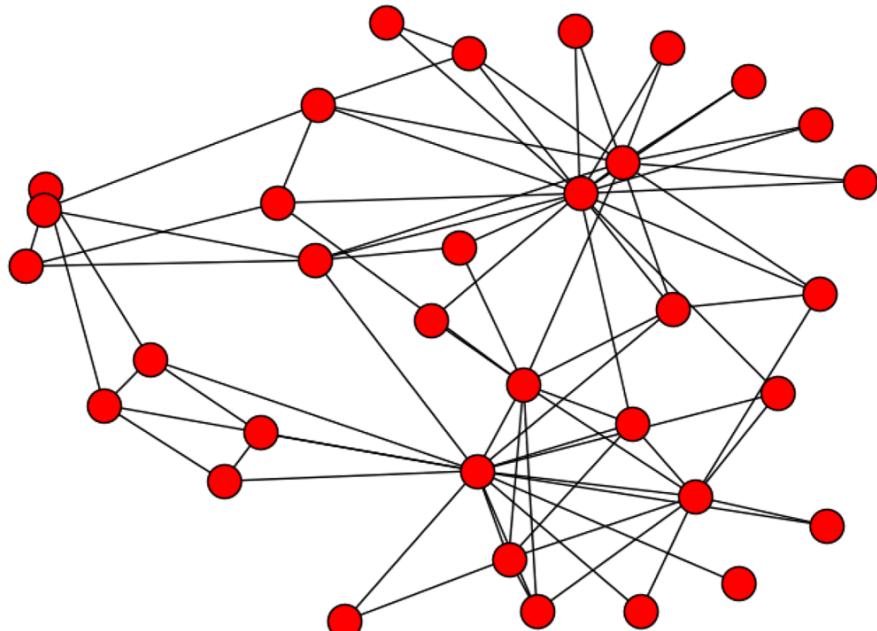
No contexto da metabolômica baseada em MS, para avaliação das análises direcionadas (*target*), costuma-se utilizar detectores de massas com baixa resolução, como os do tipo quadrupolo, já para as análises *untargeted*, os analisadores têm uma alta resolução como, por exemplo, o detector do tipo TOF (*Time-of-Flight*) (PANG; HU, 2023).

#### 1.4 Redes Complexas

As redes complexas consistem em uma abordagem interdisciplinar que contempla diferentes áreas de conhecimento como a ciência da computação, matemática, física e biologia. O termo consiste em um par de conjuntos (grafo), composto por elementos chamados nós ou vértices e um conjunto de elos de conexão (arestas) que interligam os nós, representando as interações entre eles (BARABÁSI, 2003; MATA, 2020).

De maneira geral, essas redes são estruturas que não seguem um padrão ordenado de dados e são denominadas como complexas pois, não é possível prever seu comportamento coletivo a

partir de seus componentes individuais. Entretanto, a compreensão da descrição matemática dessas redes possibilita interessantes previsões sobre os sistemas sendo possível, inclusive, controlá-los. (METZ et al., 2007; MATA, 2020). Na Figura 3 é possível verificar um simples exemplo do que se tratam as redes complexas através da modelização da rede por meio da apresentação de um gráfico de correlações. Na figura em questão, os nós (em vermelho), representam pessoas e as linhas pretas que fazem a ligação entre eles, representa a interação entre 34 membros de um clube de karatê (MATA, 2020).



**FIGURA 3. Exemplo de representação de uma rede complexa.** Rede complexa de um estudo de interações sociais de 34 membros de um grupo de karatê. Fonte: MATA, 2020.

As redes operam sob uma forma não direcionada e as correlações significativas ( $p < 0,05$ ) entre as variáveis podem ser utilizadas para identificar os nós mais influentes na estrutura topológica da rede. Neste sentido, em um contexto genérico, cada nó tem a mesma relevância dentro da rede. Entretanto, abordagens recentes no âmbito das redes, têm possibilitado a determinação de alvos específicos dentro da topologia, consistindo em abordagens denominadas *target*. Neste contexto, incorpora-se ao "nó alvo" um peso maior que dos demais, o que ao final

dos cálculos da rede, fornecerão informações mais direcionadas sobre as influências dos nós (KRAEMER, 2022).

Para que seja possível realizar a análise da topologia das redes complexas, as métricas de centralidade são cruciais. Por um exemplo, através da utilização do *eigenvector*, uma métrica que irá destacar os nós considerando a importância da conexão com os nós das vizinhanças. Assim, o *eigenvector* irá computar a centralidade do nó baseado em seus vizinhos e nos pesos das conexões de suas arestas. Portanto, em um ranking de scores de influência dos nós na rede aferida por uma abordagem por *eigenvector*, quanto maior for o valor da centralidade do autovetor, maior será o seu grau de influência na rede (MATA, 2020; GOBATTO, 2020; KRAEMER, 2022).

Sendo assim, o presente trabalho objetivou realizar a análise metabolômica de perfis plasmáticos de indivíduos distintos, para uma avaliação e posteriormente, correlação da expressão metabólica final do organismo em diferentes situações de níveis de IMC e de atividade física. A ferramenta da Esportômica, associada à análise de redes complexas multivariadas, foi capaz de auxiliar na rastreabilidade de metabólitos indicativos de diferentes estados do organismo. Adiante, no Capítulo I do presente documento, encontra-se o artigo experimental aceito para publicação detalhando os ricos achados do presente projeto.

## **2. OBJETIVOS**

### **2.1 Objetivo Geral**

Verificar o efeito do IMC e do nível auto-reportado de atividade física sobre metabólitos plasmáticos.

### **2.2 Objetivos Específicos**

- Verificar a abundância de metabólitos plasmáticos em indivíduos com IMC eutrófico ou sobrepeso e obeso;
- Verificar a abundância de metabólitos plasmáticos em indivíduos com níveis auto-reportados de atividade física baixo ou alto;
- Verificar o efeito combinado entre o IMC e o nível auto-reportado de atividade física na abundância de metabólitos plasmáticos;
- Propor um modelo para classificação da relevância das principais modulações plasmáticas promovidas pelo IMC e/ou pelo nível auto-reportado de atividade física.

### 3. CAPÍTULO 1: Artigo aceito para publicação

*Article*

# Combined Association of Plasma Metabolites with Body Mass Index and Physical Activity Level

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**Simple Summary:** This correlative and exploratory study aimed to comprehensively assess the plasma metabolite profiles of subjects with lean versus overweight/obese body mass index, and low or high self-reported levels of physical activity using untargeted metabolomic and bioinformatic approaches. The majority of the changes detected in the study were attributable to body mass index, although some effect of self-reported levels of physical activity was also observed. Interaction effects were found when subgroups of body mass index were combined with subgroups of self-reported levels of physical activity, indicating a combined modulation.

**Citation:** To be added by editorial staff during production.

Academic Editor: Firstname  
Lastname

Received: date

Revised: date

Accepted: date

Published: date



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**Abstract:** Metabolomic analysis of the changes of plasma metabolites in obesity along with physical activity interaction may contribute to disease diagnosis and treatment. We sought to make a comprehensive assessment of the plasma metabolite profile of subjects with lean (n = 20, BMI = 22.3) or overweight/obese (n = 29, BMI = 29) body mass index (BMI) and low (n = 33, IPAQ = 842) or high (n = 16, IPAQ = 6935) index of physical activity questionnaire (IPAQ), using an untargeted metabolomic approach. Two-way analysis of variance was applied to the data obtained from Liquid Chromatography-Mass Spectrometry analyses and resulted in 64 metabolites, mainly responsible for the data variance among the different groups. Finally, a complex network approach reveals the most relevant metabolites. The majority of the relevant metabolites are oxidized species of phospholipids. Most species of phosphatidylcholine and a species of phosphatidylglycerol were found to be decreased in obese subjects, while most species of phosphatidylethanolamine, phosphatidylserine, and phosphatidylinositol were increased. Only a single species each of prostaglandin, phosphatidylglycerol, and phosphatidylinositol was modulated by IPAQ, but interaction effects between BMI and IPAQ were found for most of the metabolites in the combination of obese BMI with low IPAQ. **Keywords:** body mass index; index of physical activity questionnaire; obesity; metabolomic

## 1. Introduction

A threat to global health, obesity is a chronic disease caused by increased body fat deposition and is estimated to affect up to 30% of the world population, including overweight and obese individuals [1]. Obesity is typically diagnosed by estimating the body mass index (BMI), which is associated with total plasma levels of triglycerides, diglycerides and free fatty acids [2], along with metabolic alterations incident to the disease [3]. Obesity is multifactorial, and the chance of developing this disease may be affected by endogenous factors like genetics [4], with an estimated heritability of 40-70% [5, 6] and exogenous factors such as the environment and even socioeconomic status [7]. Due to the growth of the obesity pandemic in recent decades [8], obesity has been intensively studied in an attempt to better understand the etiology of the disease and to find more effective prophylaxis and therapy [9].

Metabolomic is the molecular study of a biological system with molar weight of up to 1500 Da [10]. There are thousand metabolites in the human organism, and identifying them and discovering their roles still pose a challenge, even for the metabolomic approach. Several studies have reported metabolic patterns associated with obesity, liquid chromatography mass spectrometry (LC-MS) characterization of the metabolomic profile [11] and the lipidomic signature of subjects with high levels of triglycerides and cholesterol [12] are recent advances in the study of obesity.

Compelling evidence shows that the physiological modifications caused by physical training can prevent or delay the onset of obesity [13], and that physical activity can modulate endogenous metabolites [14, 15]. Therefore, obesity and the level of physical activity may play a role in modulating the same metabolites due to their close and antagonist relationship, but the metabolic alterations in the presence of the disease remain to be elucidated. Understanding and identifying the metabolomic fingerprint of the interaction between obesity and physical exercise may help to better understand human organism responses from a molecular perspective.

Changes in lipid metabolism associated to obesity have been linked to the development of obesity-related comorbidities [16, 17]. These changes include elevated levels of plasma triglycerides, total cholesterol, low-density lipoprotein (LDL), oxidized LDL, and decreased concentrations of high-density lipoprotein (HDL) [18]. A variety of plasma metabolite families, including fatty amide, prenollipid, sphingolipid, branched-chain amino acid and various derivatives of amino acids, acylcarnitines, fatty acids, and lysophospholipids, have been discovered to have associations with BMI [19–21].

Furthermore, changes in glycerophospholipids may contribute to the pathological process of metabolic diseases, according to a number of studies [19]. Numerous studies have reported phospholipids that characterize the obesity profile, but the direction of changes is controversial [3, 18, 22, 23]. Obese subjects may exhibit increased levels of phosphatidylinositol (PI) [24]. Phosphatidylcholines (PCs) and phosphatidylethanolamines (PEs) account for 50% and 20-30% of the membrane composition, respectively [25] and disturbances in PCs and/or PEs may be a risk factor for obesity development [19, 26]. Both choline and ethanolamine appear to be altered in the plasma/serum of obese subjects in other untargeted approaches. Increased lysophosphatidylcholine (lysoPC) C14:0 and lysoPC C18:0 were found in

obese subjects [18], and several lysoPCs respond to fluctuations in BMI [21]. On the other hand, lysoPC C18:1 and C18:2 were decreased in obese children [23] and adults [18] and inversely correlated with BMI [27]. Other authors have reported decreased levels of these compounds [24, 28, 29] and correlation between plasma levels of lysoPC, sphingomyelins, and PCs with obesity after weight loss [30]. Nevertheless, whether plasma/serum levels of PCs and PEs may be related to obesity in humans still needs to be further investigated.

Regarding the isolated effect of physical activity, the literature is relatively scarcer. Associations for lysoPC(20:3), PC(16:0/20:3), PC(18:0/20:3), and PC(18:1/20:3) were inversely associated with concentrations of diabetes-associated glycerophospholipids [31]. However, when the level of physical activity was grouped as low or high (<2226 vs. ≥2226 MET-min/week in men; or <2079 vs. ≥2079 MET-min/week in women), the aforementioned associations among glycerophospholipids were observed only in participants with low physical activity [31].

In this exploratory study, the metabolomic fingerprints of Brazilian subjects with varying BMIs and levels of physical activity were identified in this study. After assembling a network of correlations (Pearson), the main compounds were determined via an eigenvector centrality analysis.

## 2. Material and Methods

### 2.1. Ethics and Subjects

All procedures were approved by the Human Subject Research Ethics Committee of São Francisco University (Protocol number 12087719.5.0000.5514) before the study began. Twenty-seven female and twenty-two male subjects were enrolled in the study (Table 1) and signed written informed consent form regarding the procedures involved in the investigation. The inclusion criteria were as follows: (I) body mass index above 18 kg/m<sup>2</sup>; (II) age between 18 and 60 years; (III) healthy values of body temperature, heart rate, and blood pressure; and (IV) fasting for 12 hours. The exclusion criteria were as follows: (I) history of medical illness, drug, or alcohol abuse; (II) pregnancy or breastfeeding; (III) hospital admission or surgery within the last 3 months; (IV) blood donation or loss within the last month; (V) participation in another clinical trial within the last 3 months; and (VI) chronic medication use or use within the last 2 weeks.

**Table 1.** Descriptive statistics when grouping the subjects by the body characteristics (according to BMI) and physical activity levels (according to IPAQ).

Grouping by the BMI		Grouping by the IPAQ	
Lean	Overweight / Obese	Low	High IPAQ > 3066

	<b>18 &lt; BMI &lt; 25</b>	<b>BMI ≥ 25</b>	<b>IPAQ ≤ 3066</b>	
<b>Sex</b>	F = 10, M = 10	F = 17, M = 12	F = 19, M = 14	F = 8, M = 8
<b>Age (years)</b>	29 ± 10	35 ± 13	34 ± 14	29 ± 9
<b>Body Mass (kg)</b>	62.6 ± 8	78.3 ± 10#	73.1 ± 13	69.4 ± 9
<b>Height (m)</b>	1.67 ± 0.1	1.64 ± 0.1	1.66 ± 0.1	1.66 ± 0.1
<b>BMI (kg/m<sup>2</sup>)</b>	22.3 ± 2	28.9 ± 3#	26.8 ± 5	25.2 ± 2
<b>IPAQ (Score)</b>	3361 ± 2823	2467 ± 4019	842 ± 890	6935 ± 3538*

Data are in the mean ± SD. One-way ANOVA was used (Statistica 7.0 - Statsoft). # indicates significant differences ( $p < 0.05$ ) in relation to Lean group. \* indicates significant difference ( $p < 0.05$ ) in relation to Low IPAQ group. F = Female and M = Male.

## 2.2 Determination of the body mass index

Anthropometric data of weight and height were obtained with a scale and stadiometer (Welmy, São Paulo, Brazil). The BMI was calculated as the ratio of body weight (kg) to height squared (m<sup>2</sup>). Values less than 25 kg/m<sup>2</sup> were classified as lean, and values greater than 25 kg/m<sup>2</sup> were classified as overweight/obese.

## 2.3 Determination of the level of physical activity (index of physical activity questionnaire – IPAQ)

The subjects answered 6 topics from the short version of the Index of Physical Activity Questionnaire (IPAQ), validated to the Brazilian population, regarding their physical activity frequency, duration, and intensity to assess their physical activity level [32, 33]. Participants were classified into two levels of physical activity based on the IPAQ: low activity (IPAQ ≤ 3066) and high activity (IPAQ > 3066).

## 2.4 Experimental Design

### 2.4.1. Grouping the subjects by the body mass Index

In one of the two approaches, the overall sample was segmented into two groups based on objective criteria related to BMI (Lean: 18 < BMI < 25; Overweight/Obese: BMI ≥ 25) to search for differences in lipid metabolites between these groups (Table 1).

### 2.4.2. Grouping the subjects by the physical activity level (IPAQ)

In the other approach, the same sample was segmented into two groups based on objective criteria related to the IPAQ (Low: IPAQ ≤ 3066; High: IPAQ

> 3066) to search for lipid metabolites modulated by the level of physical activity (Table 1).

#### 2.4.3. BMI/IPAQ Interactions

In addition to the aforementioned groups, statistical differences were verified for the following combinations (interactions) between subgroups of BMI and IPAQ: Lean + Low (n = 13); Lean + High (n = 7); Overweight/Obese + Low (n = 20); Overweight/Obese + High (n = 9).

#### 2.5 Metabolomics Analysis

Intravenous blood samples (5ml) were obtained from the forearm by a trained professional into centrifuge tubes containing EDTA anticoagulant. Blood was drawn from the subject in a sitting position in the morning after a 12-hour fast. The samples were centrifuged at 1500 rpm for 10 minutes, and the plasma fractions were separated and stored in microcentrifuge tubes at -80°C.

A pooled sample was formed before sample extraction by combining equal parts of each sample (20 µL), which were then aliquoted into different quality control (QC) samples and extracted alongside the other samples. Plasma samples (150 µL) were randomized and mixed with cold isopropanol (200 µL), vortexed for 30 seconds, and then centrifuged (12,000 rpm, 4°C, 10 min). Subsequently, the supernatant (200 µL) was collected and dried under N2. Blank samples were prepared using ultra-pure water instead of plasma. To monitor deviations in extraction and system stability, QC samples were inserted after every 10 samples. Additionally, a QC sample was employed at the outset of the experiment to facilitate instrumental stabilization of the LC-MS system. Participant samples were extracted and analyzed in a randomized manner to observe biological variation and minimize instrumental bias.

The analysis was adapted from Silva et al. [34]. An ACQUITY UPLC was used, coupled to a XEVO-G2XS (QTOF) quadruple time-of-flight mass spectrometer (Waters, Manchester, UK) equipped with an ESI (Electrospray Ionization) source. For lipidomics analysis, an ACQUITY UPLC® CSH C18 column (2.1 mm x 100 mm x 1.7 µm, Waters) was employed, using mobile phase A composed of an acetonitrile (ACN):water (H2O) solution (60:40, v/v) with 10 mM ammonium formate + 0.1% formic acid, and mobile phase B composed of isopropanol:acetonitrile (ACN) (90:10, v/v) with 10 mM ammonium formate + 0.1% formic acid, with a flow rate of 0.4 mL min<sup>-1</sup>.

The gradient started at 40% B, increasing to 43% within 2.0 minutes, further rising to 50% over 0.1 minutes, then reaching 54% within the next 9.9 minutes. Subsequent increments led to 70% B over 0.1 minutes, 99% B over 5.9 minutes, and eventually returning to 40% B over 0.1 minutes for column re-equilibration over the next 1.9 minutes. The total run time was 20 minutes. Data were recorded separately in positive (+) and negative (-) ion modes across the 50–1700 m/z range with an acquisition time of 0.5 seconds per scan. Source and desolvation temperatures were set at 140 °C and 550 °C (+), 400 °C (-), respectively, with a desolvation gas flow of 900 L h<sup>-1</sup>. Capillary voltages were 3.0 kV (+) and 2.5 kV (-), with a cone voltage of 40 V. S Leucine enkephalin (molecular weight = 555.62; 200 pg µL<sup>-1</sup> in 1:1 ACN:H2O) served as a lock mass for precise mass measurement [12].

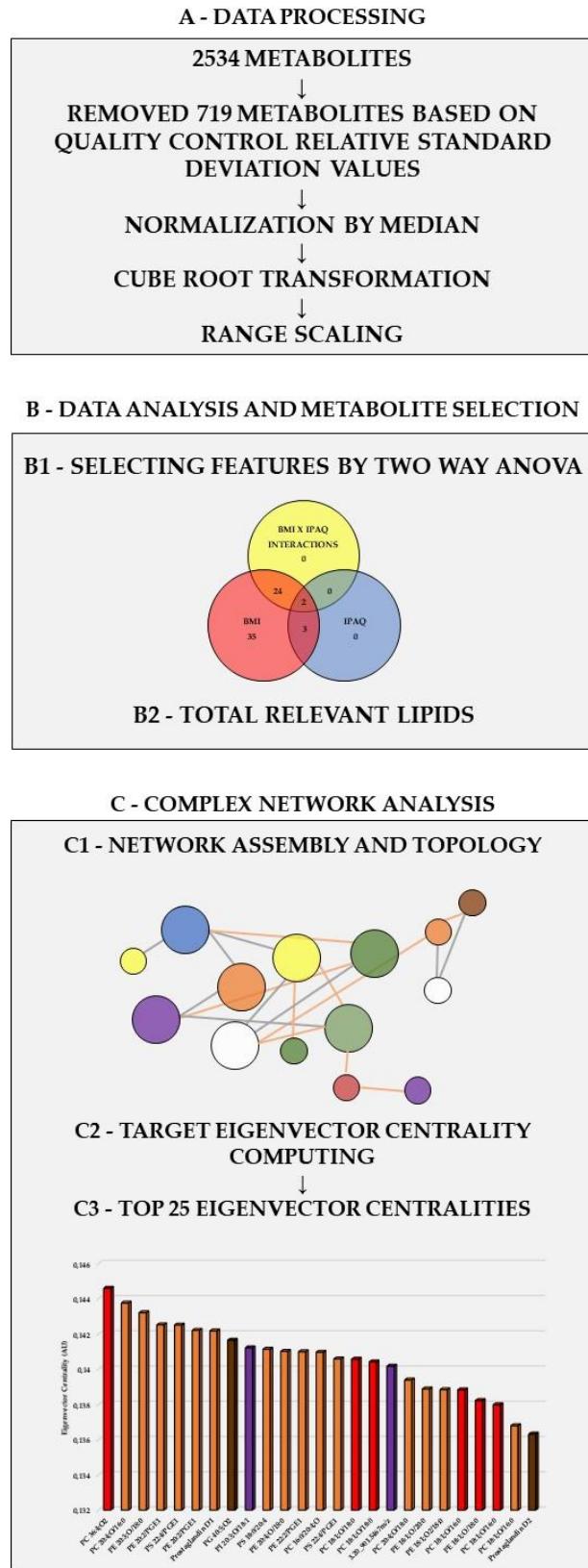
## *2.6 Statistical Analysis*

For didactical reasons, the statistical section was divided into different steps: data processing (2.6.1), data analyses and metabolite selection (2.6.2), and metabolite selection and complex network analysis (2.6.3). These steps are illustrated in Figure 1.

### *2.6.1. Data Processing*

LC-MS raw files were processed using Progenesis QI 2.4 software (Nonlinear Dynamics, Newcastle, UK) for peak alignment, deconvolution, selection of possible adducts, and compound annotation based on data-independent acquisition (MSE). Metabolite identification relied on MS1 and MS2 experiments [35]. In the same spectrum, both low and high energy acquisition provided information on precursor ions (mass error  $\leq$  5 ppm) and fragments (mass error  $\leq$  10 ppm). Fragmentation Score, Mass Accuracy, Mass Error, Isotope Similarity, and Physiological function were assessed to accept the annotated molecules. To ensure compatibility between Progenesis PQI data and external SDF-based spectra libraries, we developed an in-house software called "SDF2PQI" to enhance fragment matches [36]. External SDF-based spectra libraries utilized included LipidMaps (<http://www.lipidmaps.org/>), Human Metabolome Database (<http://www.hmdb.ca/metabolites>), and MoNA - MassBank of North America (<https://mona.fiehnlab.ucdavis.edu/>). The identified levels were based on Sah et al. [37] and Liebicsh et al. [38] (Supplementary Material - Tables S1 and S2).

Data processing was performed with Metaboanalyst 6.0 (Xia Lab). Analysis of the LC-MS revealed 2534 compounds with different mass/charge ratios. Among these, 719 were removed based on quality control relative standard deviation values, resulting in 1815 features normalized to the sample median, transformed with cube root, and scaled by range (Figure 1 - A).



**Figure 1.** Sequence of Data processing and analysis sequence: (A) Data processing; (B) Data analysis and metabolite selection; (C) Complex network analysis.

### 2.6.2. Data Analysis and metabolite selection

A two-way analysis of variance (Metaboanalyst 6.0, Xia Lab) was applied to identify the main lipids contributing to the variance in the data across groups based on BMI or IPAQ levels. Features with a significant difference (raw  $p < 0.05$ ) were selected in the two-way ANOVA between the groups of BMI or IPAQ or their Combination (Figure 1 - B1).

The relevant metabolites for BMI, IPAQ, or their interaction were combined into a single set comprising 64 metabolites (Figure 1 - B2) for the assembly of the correlation network.

### 2.6.3. Complex network analysis

Based on significant Pearson correlations ( $p < 0.05$ ) between the 64 relevant metabolites, a complex network topology was constructed (Figure 3 - C1). Both positive and negative correlations were bidirectional and equally significant in this case. The correlation coefficient between the linked nodes (metabolites), which varies from 0.01 to 1 (negative coefficients are treated as positive, and greater values indicate a stronger correlation), and the proximity degree to the BMI node, which ranges from 0.01 to 1 (ranging from 0.01 to 1; higher values indicate closer proximity), are multiplied to determine the edge weight. Stated differently, the edge weight is calculated by dividing the correlation coefficient between two nodes by the least number of edges needed to reach the BMI node. Therefore, when edges were directly linked (correlated) to the BMI, they were given a weight equal to their respective correlation coefficient. Second-degree connections with the BMI were assigned a weight of 0.5 (half) of the correlation coefficient, while third, fourth, and fifth-degree connections were assigned weights of 0.25, 0.125, and 0.0625, respectively [39]. The target eigenvector scores were computed using these edge weights as connection strengths. Using the NetworkX 2.5 module for the Python programming language in the Jupyter Notebook integrated development environment, eigenvector centrality scores were calculated. The  $i^{\text{th}}$  element of the vector  $x$  formed by the equation  $Ax = \lambda x$ , where  $A$  is the adjacency matrix of the graph  $G$  with eigenvalue  $\lambda$ , represents the eigenvector centrality for node  $i$ . If  $\lambda$  is the biggest eigenvalue of the adjacency matrix  $A$ , then there exists a unique solution  $x$  for which all entries are positive. A node's centrality is calculated by the targeted eigenvector using the weights of its edge connections and the centrality of its neighbors [40] (Figure 1 - C2).

## 3. Results

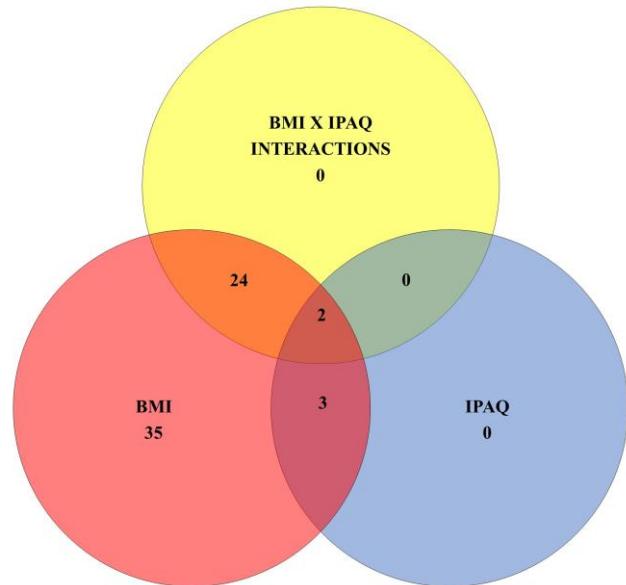
There is no association between BMI and IPAQ (-0.2,  $p = 0.16$ ) when analyzing the overall sample ( $n = 49$ ). However, different patterns of association were found between subgroups of lean or overweight/obese BMI and low or high IPAQ. Moreover, the only significant correlation found was the direct association between overweight/obese BMI and high IPAQ (Table 2).

**Table 2.** Correlation coefficients between subgroups of Lean or Overweight/Obese body mass index (BMI) with Low or High physical activity questionnaire (IPAQ)

	Lean BMI	Overweight/Obese BMI
Low IPAQ	0.29 (n = 13)	-0.42 (n = 20)
High IPAQ	-0.28 (n = 7)	0.71* (n = 9)

\*Significant correlation ( $p < 0.05$ )

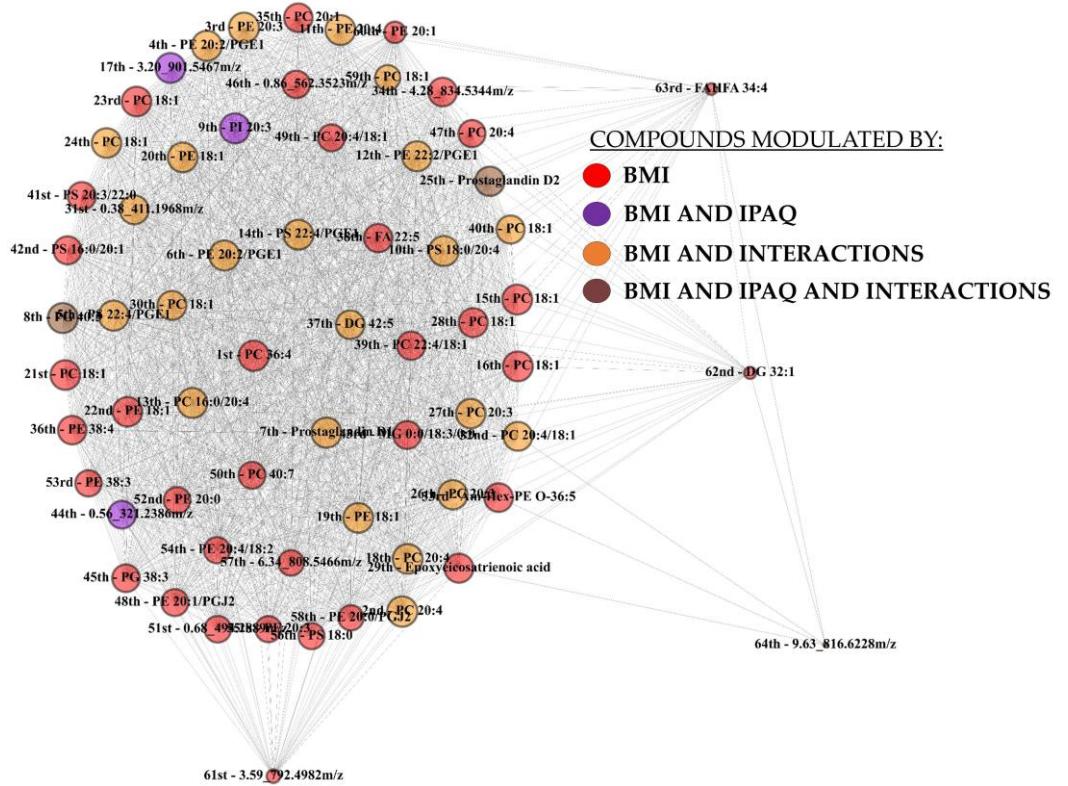
From a total of 1815 molecular features, 64 metabolites were found to have altered concentrations between groups (Supplementary Material - Tables S1 and S2). As shown in the Venn diagram (Figure 2), these significant differences were mainly due to BMI rather than IPAQ. When separated by groups, exactly 64 metabolites were shown to be affected by BMI, 5 by IPAQ, and 26 by interactions between BMI and IPAQ phenotypes (Lean + Low or Lean + High or Overweight/Obese + Low or Overweight/Obese + High). Interaction effects occur when the combined influence of factors affects the dependent measure. In the presence of an interaction effect, the effect of one factor is contingent upon the level of the other factor. The intersection between BMI and IPAQ (purple area) comprises 3 metabolites, while the intersection between BMI and Interaction (orange area) includes 24 metabolites, and the intersection between IPAQ and Interaction (green area) contains no metabolites. Only 2 metabolites are present in the intersection among BMI, IPAQ, and Interaction (brown area).



**Figure 2.** Venn diagram illustrating the number of metabolites modulated by the body mass index (BMI) in regions colored red, orange, purple, and brown; the number of metabolites influenced by the index of physical activity (IPAQ) in regions colored blue, purple, green, and brown; and the number of

metabolites affected by the BMI/IPAQ interaction in regions with yellow, orange, green, and brown colors.

A network was assembled based on significant correlations among the 64 up-regulated metabolites, and eigenvector centrality was computed (Figure 3). Eigenvector centrality indicates the relevance of the metabolite to the network system and is based on the relevance of its neighbors. Initially, a weight value based on the coefficient of correlation between two metabolites and their association with BMI was attributed to each edge of the network (see methods for more details). Then, a first eigenvector value for each node is calculated by the sum of its links. The calculation of the eigenvector is repeated until the values of the network have become stable.



**Figure 3.** Representation of the complex network assembled with 64 metabolites as nodes and significant correlations between them as edges. The size of the node is equivalent to its eigenvector or relevance in the network. Metabolites modulated by the body mass index are shown in colors red, purple, orange, and brown, while those modulated by the index of physical activity questionnaire are represented in colors purple and brown. Metabolites affected by an interaction between BMI and IPAQ are depicted in colors orange and brown. Negative and positive correlations are represented by brown and gray edges, respectively.

Regarding the statistical main effects, all identified metabolites present in the correlation network were significant different between BMI groups,

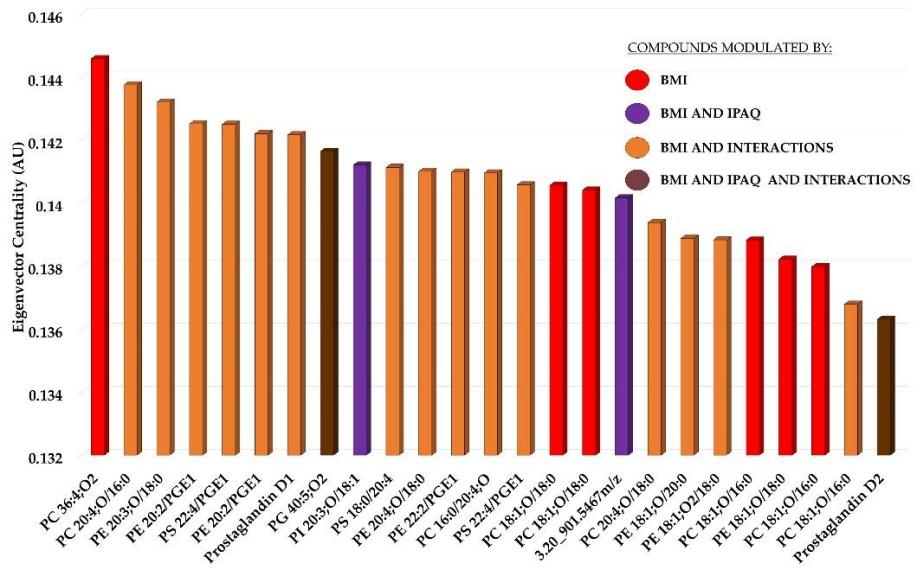
while few were different between IPAQ groups (Table 3). Not identified compounds can be found in supplementary material (Table S2).

**Table 3.** Eigenvector rank, chemical class, metabolite description, adducts, formula, and main effects values (p) of all identified metabolites present in the correlation network

Eigenvector Rank	Chemical Class	Metabolite	Adducts	Formula	BMI (p)	IPAQ (p)
1 <sup>st</sup>	Oxidized Phosphatidylcholine	PC 36:4;O2	M+FA-H	C44H80NO9P	<b>0.009</b>	0.098
2 <sup>nd</sup>	Oxidized Phosphatidylcholine	PC 20:4;O/16:0	M+FA-H	C44H80NO9P	<b>0.009</b>	0.116
3 <sup>rd</sup>	Phosphatidylethanolamine	PE 20:3;O/18:0	M-H2O-H. M-H	C43H78NO9P	<b>0.004</b>	0.133
4 <sup>th</sup>	Phosphatidylethanolamine	PE 20:2/PGE1	M+FA-H	C45H80NO11P	<b>0.010</b>	0.179
5 <sup>th</sup>	Oxidized Phosphatidylserine	PS 22:4/PGE1	M+FA-H	C48H80NO13P	<b>0.004</b>	0.199
6 <sup>th</sup>	Phosphatidylethanolamine	PE 20:2/PGE1	M+FA-H	C45H80NO11P	<b>0.008</b>	0.220
7 <sup>th</sup>	Prostanoid	Prostaglandin D1	M-H2O-H	C20H34O5	<b>0.003</b>	0.128
8 <sup>th</sup>	Oxidized Phosphatidylglycerol	PG 40:5;O2	M+FA-H	C46H81O12P	<b>0.002</b>	0.031
9 <sup>th</sup>	Oxidized Phosphatidylinositol	PI 20:3;O/18:1	M-H	C47H83O14P	<b>0.003</b>	0.036
10 <sup>th</sup>	Oxidized Phosphatidylserine	PS 18:0/20:4	M-H	C45H80NO9P	<b>0.005</b>	0.171
11 <sup>th</sup>	Phosphatidylethanolamine	PE 20:4;O/18:0	M-H	C43H78NO9P	<b>0.008</b>	0.135
12 <sup>th</sup>	Phosphatidylethanolamine	PE 22:2/PGE1	M+FA-H	C47H84NO11P	<b>0.004</b>	0.141
13 <sup>th</sup>	Oxidized Phosphatidylcholine	PC 16:0/20:4;O	M+FA-H	C44H80NO9P	<b>0.011</b>	0.133
14 <sup>th</sup>	Oxidized Phosphatidylserine	PS 22:4/PGE1	M+FA-H	C48H80NO13P	<b>0.008</b>	0.142
15 <sup>th</sup>	Oxidized Phosphatidylcholine	PC 18:1;O/18:0	M+FA-H	C44H84NO9P	<b>0.004</b>	0.214
16 <sup>th</sup>	Oxidized Phosphatidylcholine	PC 18:1;O/18:0	M+FA-H	C44H84NO9P	<b>0.004</b>	0.184
18 <sup>th</sup>	Oxidized Phosphatidylcholine	PC 20:4;O/18:0	M+FA-H	C46H84NO9P	<b>0.005</b>	0.134
19 <sup>th</sup>	Oxidized Phosphatidylethanolamine	PE 18:1;O/20:0	M-H	C43H82NO9P	<b>0.002</b>	0.201
20 <sup>th</sup>	Oxidized Phosphatidylethanolamine	PE 18:1;O2/18:0	M-H2O-H	C41H80NO10P	<b>0.004</b>	0.191
21 <sup>st</sup>	Oxidized Phosphatidylcholine	PC 18:1;O/16:0	M+FA-H	C42H80NO9P	<b>0.014</b>	0.229
22 <sup>nd</sup>	Oxidized Phosphatidylethanolamine	PE 18:1;O/18:0	M-H2O-H	C41H80NO10P	<b>0.006</b>	0.146
23 <sup>rd</sup>	Oxidized Phosphatidylcholine	PC 18:1;O/16:0	M+FA-H	C42H80NO9P	<b>0.004</b>	0.164
24 <sup>th</sup>	Oxidized Phosphatidylcholine	PC 18:1;O/16:0	M+FA-H	C42H80NO9P	<b>0.005</b>	0.186
25 <sup>th</sup>	Prostanoid	Prostaglandin D2	M-H	C20H32O5	<b>0.001</b>	0.022
26 <sup>th</sup>	Oxidized Phosphatidylcholine	PC 20:3;O2/18:1	M+FA-H	C46H84NO9P	<b>0.004</b>	0.138
27 <sup>th</sup>	Oxidized Phosphatidylcholine	PC 20:3;O/18:0	M+FA-H	C46H84NO9P	<b>0.005</b>	0.111
28 <sup>th</sup>	Oxidized Phosphatidylcholine	PC 18:1;O/20:4	M+FA-H	C46H80NO9P	<b>0.004</b>	0.091
29 <sup>th</sup>	Epoxyeicosatrienoic acid	Epoxyeicosatrienoic acid	M-H	C20H32O3	<b>0.011</b>	0.078
30 <sup>th</sup>	Oxidized Phosphatidylcholine	PC 18:1;O2/18:3	M+FA-H	C44H80NO10P	<b>0.014</b>	0.159
32 <sup>nd</sup>	Oxidized Phosphatidylcholine	PC 20:4/18:1;O	M+FA-H	C46H80NO9P	<b>0.005</b>	0.124
33 <sup>rd</sup>	Glycerophosphoethanolamine glycans	Am-Hex-PE O-36:5	M-H2O-H	C47H84NO12P	<b>0.002</b>	0.111
35 <sup>th</sup>	Oxidized Phosphatidylcholine	PC 20:1;O	M-H2O-H	C28H54NO9P	<b>0.000</b>	0.270
36 <sup>th</sup>	Oxidized Phosphatidylethanolamine	PE 38:4;O	M-H	C43H78NO9P	<b>0.001</b>	0.136
37 <sup>th</sup>	Diacylglycerol	DG 42:5;O2	M+Na-2H	C45H78O8	<b>0.000</b>	0.086
38 <sup>th</sup>	Docosanoid	FA 22:5;O2	M-H2O-H	C22H34O4	<b>0.006</b>	0.068
39 <sup>th</sup>	Oxidized Phosphatidylcholine	PC 22:4/18:1;O	M+FA-H	C48H84NO9P	<b>0.002</b>	0.072

40 <sup>th</sup>	Oxidized Phosphatidylcholine	PC 18:1;O/18:2	M+FA-H	C44H80NO9P	<b>0.006</b>	0.155
41 <sup>st</sup>	Phosphatidylserine	PS 20:3/22:0	M-H2O-H	C48H88NO10P	<b>0.002</b>	0.087
42 <sup>nd</sup>	Diacylglycerophosphoserine	PS 16:0/20:1	M+FA-H	C42H80NO10P	<b>0.004</b>	0.246
43 <sup>rd</sup>	Monoacylglycerol	MG 0:0/18:3/0:0	2M-H	C21H36O4	<b>0.001</b>	0.293
45 <sup>th</sup>	Oxidized Phosphatidylglycerol	PG 38:3;O2	M+FA-H	C44H81O12P	<b>0.001</b>	0.416
47 <sup>th</sup>	Oxidized Phosphatidylcholine	PC 20:4;O/20:0	M-H2O-H	C48H88NO9P	<b>0.002</b>	0.123
48 <sup>th</sup>	Oxidized Phosphatidylethanolamine	PE 20:1/PGJ2	M-H2O-H	C45H78NO10P	<b>0.006</b>	0.385
49 <sup>th</sup>	Phosphatidylcholine	PC 20:4/18:1	M-H	C46H82NO8P	<b>0.003</b>	0.352
50 <sup>th</sup>	Oxidized Phosphatidylcholine	PC 40:7;O	M-H	C48H82NO9P	<b>0.004</b>	0.149
52 <sup>nd</sup>	Phosphatidylethanolamine	PE 20:0	M-H	C25H50NO8P	<b>0.008</b>	0.112
53 <sup>rd</sup>	Oxidized Phosphatidylethanolamine	PE 38:3;O	M-H	C43H80NO9P	<b>0.012</b>	0.166
54 <sup>th</sup>	Phosphatidylethanolamine	PE 20:4/18:2	M-H. M+Na-2H	C43H74NO8P	<b>0.002</b>	0.363
55 <sup>th</sup>	Oxidized Phosphatidylethanolamine	PE 20:3;O/16:0	M-H	C41H76NO9P	<b>0.007</b>	0.073
56 <sup>th</sup>	Acylglycerophosphoserine	PS 18:0;O/20:0	M+Na-2H	C44H88NO9P	<b>0.005</b>	0.316
58 <sup>th</sup>	Oxidized Phosphatidylethanolamine	PE 20:0/PGJ2	M-H2O-H	C45H80NO10P	<b>0.001</b>	0.108
59 <sup>th</sup>	Oxidized Phosphatidylcholine	PC 18:1;O/16:1	M-H2O-H	C42H78NO9P	<b>0.002</b>	0.582
60 <sup>th</sup>	Oxidized Phosphatidylethanolamine	PE 20:1;O	M-H2O-H	C25H48NO9P	<b>0.015</b>	0.648
62 <sup>nd</sup>	Diacylglycerol	DG 32:1	M+FA-H	C35H66O5	<b>0.004</b>	0.266
63 <sup>rd</sup>	Fatty Acyl esters of Hydroxy Fatty Acids	FAHFA 34:4	M-H	C34H58O4	<b>0.008</b>	0.758

The metabolites with the 25 highest eigenvector centralities were selected for further discussion and are shown in a bar graph (Figure 4). The chemical class of the metabolites in the top 25 eigenvector centralities mainly comprised oxidized compounds of Phosphatidylcholine (PC), Phosphatidylethanolamine (PE), Phosphatidylserine (PS), Phosphatidylglycerol (PG), and Phosphatidylinositol (PI), alongside non-oxidized PE and Prostanoid (Prostaglandin). Among the 25 highest eigenvector centrality scores, 6 metabolites were exclusively modulated by BMI (red). Additionally, 3 metabolites were simultaneously influenced by both BMI and IPAQ (purple), while 15 metabolites were simultaneously modulated by BMI and by an BMI/IPAQ interaction (orange). Only 2 metabolites were modulated simultaneously by BMI, IPAQ, and Interaction (brown) (Figure 4).



**Figure 4.** Top 25 highest BMI eigenvector centralities from the correlation network of metabolites modulated by the body mass index (red, purple, orange and brown), the level of physical activity (purple and brown) or their interaction (orange and brown).

Both BMI and the interaction between overweight/obese BMI and low IPAQ promoted increased abundance of the same subclasses: PC(18:1), 2 PE(20:3), 2 PE(20:2/PGE1), Prostaglandin D1, PS(18:0/20:4), and 2 PS(22:4/PGE1), indicating a cumulative effect between factors (Table 4). Another evidence of a cumulative effect between factors, IPAQ along with the interaction between lean BMI and high IPAQ, promoted increased abundance of PG(40:5) (Table 4). Moreover, all changes found for the interaction between lean BMI and high IPAQ were in the opposite direction of the changes found for obese/overweight BMI (Table 4).

**Table 4.** Direction of abundance changes of plasma metabolites and post-hoc interactions in the top 25 eigenvector rank of centralities

Eigenvector Rank	Metabolite	BMI		IPAQ		Post-hoc Interactions				
		Obese	P	High	p	Lean+Low	Lean+High	Obese+Low	Obese+High	p
4 <sup>th</sup>	PE 20:2/PGE1	↑	<b>0.010</b>	-	0.179	↓*	↓*	↑	-	<b>0.040</b>
5 <sup>th</sup>	PS 22:4/PGE1	↑	<b>0.004</b>	-	0.199	↓*	-	↑	-	<b>0.047</b>
6 <sup>th</sup>	PE 20:2/PGE1	↑	<b>0.008</b>	-	0.220	↓*	↓*	↑	-	<b>0.030</b>
7 <sup>th</sup>	Prostaglandin D1	↑	<b>0.003</b>	-	0.128	↓*	-	↑	-	<b>0.038</b>
9 <sup>th</sup>	PI 20:3;O/18:1	↑	<b>0.003</b>	↓	<b>0.036</b>	-	-	-	-	0.076
10 <sup>th</sup>	PS 18:0/20:4	↑	<b>0.005</b>	-	0.171	-	↓*	↑	-	<b>0.033</b>
12 <sup>th</sup>	PE 22:2/PGE1	↑	<b>0.004</b>	-	0.141	↓*	-	↑	-	<b>0.038</b>
14 <sup>th</sup>	PS 22:4/PGE1	↑	<b>0.008</b>	-	0.142	↓*	-	↑	-	<b>0.033</b>
17 <sup>th</sup>	3,20,901,5467m/z	↑	<b>0.003</b>	↓	<b>0.026</b>	-	-	-	-	0.075
19 <sup>th</sup>	PE 18:1;O/20:0	↑	<b>0.002</b>	-	0.201	↓*	-	↑	-	<b>0.044</b>
20 <sup>th</sup>	PE 18:1;O2/18:0	↑	<b>0.004</b>	-	0.191	↓*	-	↑	-	<b>0.049</b>
22 <sup>nd</sup>	PE 18:1;O/18:0	↑	<b>0.006</b>	-	0.146	-	-	-	-	0.052
24 <sup>th</sup>	PC 18:1;O/16:0	↑	<b>0.005</b>	-	0.186	-	-	-	-	0.063

1 <sup>st</sup>	PC 36:4;O2	↓	<b>0.009</b>	-	0.098	-	-	-	-	0.054
2 <sup>nd</sup>	PC 20:4;O/16:0	↓	<b>0.009</b>	-	0.116	↑*	-	↓	-	<b>0.042</b>
3 <sup>rd</sup>	PE 20:3;O/18:0	↓	<b>0.004</b>	-	0.133	↑*	-	↓	-	<b>0.016</b>
8 <sup>th</sup>	PG 40:5;O2	↓	<b>0.002</b>	↑	<b>0.031</b>	↑*	↑*	↓	↑*	<b>0.040</b>
11 <sup>th</sup>	PE 20:4;O/18:0	↓	<b>0.008</b>	-	0.135	↑*	-	↓	-	<b>0.022</b>
13 <sup>th</sup>	PC 16:0/20:4;O	↓	<b>0.011</b>	-	0.133	↑*	-	↓	-	<b>0.048</b>
15 <sup>th</sup>	PC 18:1;O/18:0	↓	<b>0.004</b>	-	0.214	-	-	-	-	0.052
16 <sup>th</sup>	PC 18:1;O/18:0	↓	<b>0.004</b>	-	0.184	-	-	-	-	0.059
18 <sup>th</sup>	PC 20:4;O/18:0	↓	<b>0.005</b>	-	0.134	↑*	-	↓	-	<b>0.029</b>
21 <sup>st</sup>	PC 18:1;O/16:0	↓	<b>0.014</b>	-	0.229	↑*	-	↓	-	<b>0.045</b>
23 <sup>rd</sup>	PC 18:1;O/16:0	↓	<b>0.004</b>	-	0.164	-	-	-	-	0.059
25 <sup>th</sup>	Prostaglandin D2	↓	<b>0.001</b>	↑	<b>0.022</b>	↑*	-	↓	-	<b>0.008</b>

\*Significant different from Obese+Low group; ↑ Increased; ↓ Decreased; - No significant change; PC: Phosphatidylcholine, PE: Phosphatidylethanolamine; PS: Phosphatidylserine; PG Phosphatidylglycerol; PI: Phosphatidylinositol

#### 4. Discussion

The lack of correlation between BMI and IPAQ (-0.2,  $p = 0.16$ ) is coherent with the heterogeneity of the sample, which included subjects with lean or overweight/obese BMI and low or high IPAQ. Instead of an indirect association between BMI and IPAQ, an unexpected direct correlation between overweight/obese BMI and high IPAQ was found. However, several metabolites were significantly associated in opposite ways with both BMI and IPAQ (Table S3). These pieces of evidence reinforce the importance of studying the interaction between subgroups of both BMI and IPAQ. To the best of our knowledge, this is the first molecular evidence of the combined relationship of BMI and IPAQ with plasma metabolites.

The association of oxidized plasma compounds with obesity was not the scope of this work, but almost all of the metabolites discussed here were oxidized species of phospholipids. Adipocyte hypertrophy induces endoplasmic reticulum dysfunction and the consequent accumulation of reactive oxygen species [41], leading to the establishment of low-level and chronic inflammation in obese subjects [42]. In this scenario, immunological disorders may occur as a consequence of the activation of both cell inflammatory signaling cascades [43] and the innate immune system [42]. In fact, inflammatory factors have been suggested as biomarkers of obesity [44] as well as the altered expression of genes related to metabolism and the production of adipokines [45, 46, 47]. Therefore, the decrease of 8 PCs, 2 PEs, and a PG in the overweight/obese group could be due to an increase in oxidative stress and degradation by lipid peroxidation processes that can occur in the disease. Together, our findings and the body of evidence indicate the relevance of alterations in oxidative metabolism during the disease process.

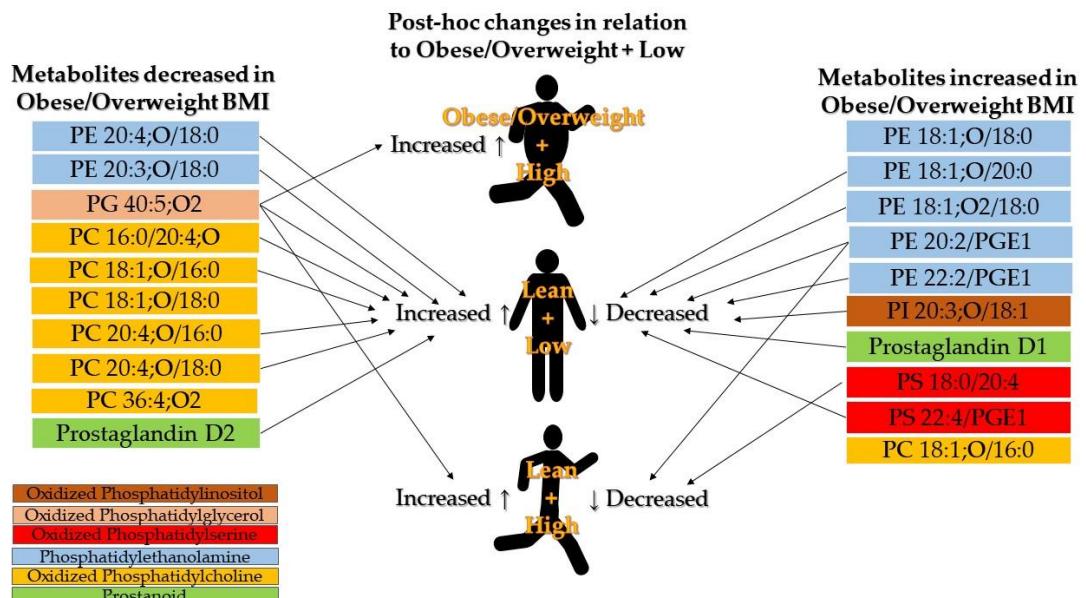
##### 4.1 Phosphatidylcholines and phosphatidylethanolamines

Unsurprisingly, most of the 25 metabolites highlighted by the network model are PCs and PEs, which are the major glycerophospholipids that make up cellular membranes. In this context, it has been demonstrated that obese

mice treated with PC 18:0/18:1 show increased glucose tolerance and insulin sensitivity [48], and evidence from other animal studies suggests a role of the PC:PE ratio in regulating muscle metabolism [49]. Additionally, PC modulates fatty acids, phospholipids, and triacylglycerol synthesis, as well as their concentrations in plasma, through changes in the master regulator of de novo synthesis [25]. Increases in lysoPC have been suggested to be related to a decrease in catabolism due to increased caloric intake [21]. In the present findings, the decreased abundance of 6 out of 7 PCs and the increased abundance of 6 out of 8 PEs may be evidence of a reduced PC:PE ratio in the overweight/obese group (Figure 5).

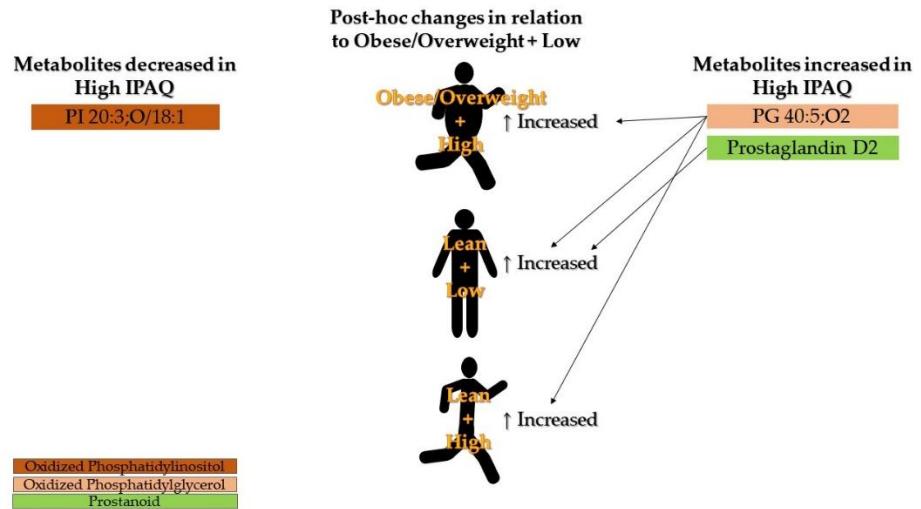
Regarding IPAQ, there was no difference between groups (Figure 6). Instead, IPAQ showed significant correlations primarily with PCs and PEs (Table S3). Among these correlations, three out of four associations found between PCs and IPAQ were positive, while all three significant associations between PEs and IPAQ were negative. Furthermore, the same PCs and PEs were associated with BMI in opposite directions.

In summary, these new insights into the relationship between BMI and IPAQ indicate that both obesity and low levels of physical activity may reduce plasma PCs and increase PE abundances.



**Figure 5.** Depiction of results of decreased (left) and increased (right) metabolites in subjects with obese/overweight BMI, along with post-hoc changes in relation to the obese/overweight + low group (center)

Higher levels of physical activity are known to prevent the initial phase of the atherosclerotic process by enhancing HDL-mediated cholesterol efflux from arterial endothelium [50]. Despite PCs being present in HDL, high IPAQ scores did not improve lipid profiles by increasing PC levels (Figure 6). Instead, predominantly decreased PC levels were observed in individuals with obese/overweight BMI, accompanied by increases in PEs (Figure 5).



**Figure 6.** Depiction of results showing decreased (left) and increased (right) metabolites in subjects with high IPAQ, along with post-hoc changes relative to the obese/overweight + low group (center)

#### 4.2 Phosphatidylglycerol

Special attention would be directed to PG, as it was the only plasma compound shown to be affected by both BMI and IPAQ independently, as well as by the interaction between overweight/obese BMI and low IPAQ (Figures 5 and 6). PG levels are directly associated with adiposity and BMI, which corroborates PG's function in preserving adipose tissue by inhibiting lipolysis under conditions of catabolic inflammation [51]. Despite this, the results of plasmatic LC-MS indicate a reduction in the species PG 40:5;O2 in subjects with overweight/obese BMI and an increase in those with high IPAQ scores. It is worth mentioning that different species of the same phospholipid class can exhibit different patterns in metabolic disease conditions. A decrease in the species PG 36:2 was observed in the liver under a condition commonly associated with obesity, albeit without changing the total levels of PG [52]. Therefore, plasmatic PG 40:5;O2 may be a metabolite sensitive to metabolic alterations due to obesity and physical activity levels, which appear to affect it in opposite directions and in a linear manner (significant correlations, Table S3).

#### 4.2 Phosphatidylinositol

Intermediates of PI play key roles in integrating the insulin-stimulated receptor with the cell membrane translocation of the glucose transporter 4 [53] and are involved in the development of obesity [54], particularly phosphatidylinositol-3,4,5-trisphosphate, which activates protein kinase B [55]. Additionally, the increased phosphorylation of PI species by phosphoinositide 3-kinase may play a role in the development of obesity-induced inflammation and insulin resistance [56]. On the other hand, the decrease in PI levels in the high IPAQ group may be associated with the inhibition of phosphoinositide 3-kinase, which has been shown to protect against high-fat diet-induced insulin resistance in mice [56]. However, impaired phosphoinositide 3-kinase signaling has been demonstrated to cause peripheral insulin resistance [57].

The decrease in the high IPAQ PI levels may be associated with a reduced emanation as triacylglycerol from adipocyte and/or an upregulation of the phosphatidic acid synthesis by the pathway that utilizes diacylglycerol originated by inositol removal of PI [58]. This is supported by the phosphatidic acid role in the activation of the target of rapamycin complex 1 that has been suggested to mediate the resistance exercise stimulated protein synthesis [59]. Although obesity may be related to plasma levels of PI, the conclusions derived are speculative.

#### 4.2 Prostaglandin

A novelty is the result of an increased abundance of plasma prostaglandin D1 (PGD1) in the obese group, while prostaglandin D2 (PGD2) was increased in the high IPAQ group (Figures 5 and 6). Prostaglandins are oxygenated fatty acids derived from arachidonic acid produced by the interaction between cytosolic phospholipase and cellular membranes [60]. PGD2 is associated with the regulation of various physiological processes and the development of diseases [60]. Previous studies on PGD2 have focused on its effects on sleep control, pain, appetite, inflammation, hypertension, cardiovascular diseases, diabetes, and obesity, but few studies have reported the levels of PGD2 in disease patients. Less studied than PGD2, PGD1 has been shown to be induced by inflammatory stimuli of atopic dermatitis and to have anti-inflammatory effects [61]. Moreover, PGD1 has been shown to reduce vascular permeability induced by other prostaglandins [62]. Therefore, further conclusions or even speculations about the role of PGD1 and PGD2 in obese and physically active subjects will require more in-depth investigation.

#### 4.3 Phosphatidylserine

Another novelty was the increased abundance of two species of PS in the obese group (Figure 5). PS, a phospholipid of the inner layer of the cell membrane, is involved in the signaling and function of intracellular proteins [63]. Additionally, translocation of oxidized PS to the outer layer of the cell surface is a signaling mechanism for cell apoptosis [45], and oxidized PS is reported to have both anti- and pro-inflammatory effects [64, 65]. Thus, the identification of oxidized PS in biological samples has the potential to serve as an obesity-specific biomarker for metabolic alterations.

#### 4.4 Limitations and future directions

The limitations of the present experimental design include the indirect diagnosis of obesity (BMI), indirect estimation of the level of physical activity (IPAQ), and the lack of validation through biomarker measurements. Another limitation is the lack of control for age and sex, as both may influence obesity outcomes [66, 67]. Although the correlations between BMI and biomarkers generally decrease with increasing age, this pattern is also observed with technically advanced measures for obesity diagnosis [67]. Therefore, measurement errors and/or recall bias could not be avoided. Future investigations can improve this aspect by restricting the sample to specific age and sex groups, including the evaluation of biomarkers frequently associated with obesity, and assessing parameters of physical performance such as aerobic and anaerobic capacities. Despite these limitations, this study

represents a first step in understanding whether metabolites can be influenced by physical condition (BMI and physical activity level). Another strength of this study is being the first to integrate and explore two scientific strategies (metabolomics and complex network analysis). The combination of these two strategies is of interest to physiologists, but its application is still limited, especially using BMI and IPAQ data. This may have interesting practical applications in medical, nutritional, and biological experimental designs.

## 5. Conclusions

The majority of relevant metabolites are oxidized species of phospholipids. Most species of PCs and a PG specie were found to be decreased in obese subjects, whereas most species of PEs, PSs, and a PI were increased. Only one species each of PGD, PG, and PI was altered with IPAQ, but interaction effects between BMI and IPAQ were found for most metabolites in the combination of obese BMI with low IPAQ. A notable finding was the increased abundance of plasma PGD1 in obese subjects, while PGD2 levels were higher in the high IPAQ group. Another significant result was the increased abundance of two species of PS in the obese group. PG deserves special attention as it was the only plasma compound affected by both BMI and IPAQ independently, as well as by the interaction between overweight/obese BMI and low IPAQ. This may provide molecular evidence of the combined relationship of BMI and IPAQ with plasma metabolites.

**Supplementary Materials:** The following supporting information can be downloaded at: link.

**Author Contributions:** Conceptualization, I.G.M.d.R., M.L. and L.C.P.; methodology, I.G.M.d.R., L.H.D.M., P.d.O.C. and A.M.P.; software, I.G.M.d.R.; formal analysis, A.A.R.S., A.M.P., P.d.O.C.; investigation, L.H.D.M.; data curation, I.G.M.d.R. and A.A.R.S.; writing—original draft preparation, I.G.M.d.R.; writing—review and editing, I.G.M.d.R., M.L., L.C.P., A.A.R.S., L.H.D.M., A.M.P., P.d.O.C., P.P.d.M.S. and I.G.M.R.; visualization, P.P.d.M.S.; supervision, I.G.M.d.R. and L.H.D.M.; funding acquisition, L.H.D.M. All authors have read and agreed to the published version of the manuscript.

**Funding:** This study was financed by the National Council for Scientific and Technological Development - CNPq (LHDM-408680/2021-0).

**Institutional Review Board Statement:** The study was conducted in accordance with the Declaration of Helsinki, and approved by the Institutional Review Board (or Ethics Committee) of University of São Francisco (Protocol number 12087719.5.0000.5514).

**Informed Consent Statement:** Informed consent was obtained from all subjects involved in the study.

**Data Availability Statement:** Not applicable.

**Acknowledgments:** We would like to express our gratitude to the study volunteers, the members of the MS4Life Laboratory of Mass Spectrometry, and the Postgraduate Program in Health Sciences at the University of São Francisco.

**Conflicts of Interest:** The authors declare no conflict of interest.

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*Supplementary Material*

# Combined Association of Plasma Metabolites with Body Mass Index and Physical Activity Level

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Information regarding all metabolites present in the network model can be found in Tables S1 (identified) and S2 (unidentified), including eigenvector centrality rank, metabolite notations, adducts, chemical formula, mass error, retention time, ANOVA F-values (F.val), main effects (p), effect size (E.S.), statistical power (Power).

**Table S1.** Identified Compounds

Eigenvector Rank	Metabolite	Adducts	Formula	Mass Error (ppm)	m/z measure d	Retention time (min)	BMI (F.val)	IPAQ (F.val)	Interaction n (F.val)	BMI (p)	IPA Q (p)	Interaction n (p)	BMI (E.S.) (p)	IPA Q (E.S.) (p)	BMI (Power)	IPAQ (Power)
1 <sup>st</sup>	PC 36:4;O2	M+FA-H	C44H80NO9P	2.15	842.557	3.15	7.5	2.842	3.882	0.009	0.098	0.054	0.82	0.43	0.99	0.83
2 <sup>nd</sup>	PC 20:4;O/16:0	M+FA-H	C44H80NO9P	2.12	842.557	2.78	7.4	2.550	4.366	0.009	0.116	0.042	0.83	0.38	0.99	0.75
3 <sup>rd</sup>	PE 20:3;O/18:0	M-H2O-H. M-H	C43H78NO9P	1.66	782.5345	3.39	9.2	2.326	6.202	0.004	0.133	0.016	0.83	0.33	0.99	0.62
4 <sup>th</sup>	PE 20:2/PGE1	M+FA-H	C45H80NO11P	0.75	886.5457	2.65	7.2	1.857	4.449	0.010	0.179	0.040	0.75	0.27	0.99	0.46

5 <sup>th</sup>	PS 22:4/PGE1	M+FA-H	C48H80NO13 P	-2.05	954.5331	2.65	9.2	1.696	4.148	0.00 4	0.199	0.047	0.88	0.23	0.99	0.36
6 <sup>th</sup>	PE 20:2/PGE1	M+FA-H	C45H80NO11 P	2.96	886.5476	2.85	7.7	1.544	4.982	0.00 8	0.220	0.030	0.80	0.21	0.99	0.30
7 <sup>th</sup>	Prostaglandin D1	M-H2O-H	C20H34O5	-2.34	335.222	0.42	9.6	2.393	4.523	0.00 3	0.128	0.038	0.83	0.34	0.99	0.65
Eigenvector Rank	Metabolite	Adducts	Formula	Mass Error (ppm)	m/z measure d	Retention time (min)	BMI (F.val )	IPAQ (F.val )	Interactio n (F.val)	BMI (p)	IPA Q (p)	Interactio n (p)	BMI (E.S.)	IPA Q (Power)	BMI (E.S.)	IPAQ (Power)
8 <sup>th</sup>	PG 40:5;O2	M+FA-H	C46H81O12P	3.17	901.5475	3.75	10.9	4.902	4.459	0.00 2	0.031	0.040	0.90	0.57	0.99	0.98
9 <sup>th</sup>	PI 20:3;O/18:1	M-H	C47H83O14P	3.18	901.5476	3.46	9.5	4.629	3.287	0.00 3	0.036	0.076	0.87	0.56	0.99	0.97
10 <sup>th</sup>	PS 18:0/20:4	M-H	C45H80NO9P	0.55	808.5502	4.28	8.8	1.926	4.827	0.00 5	0.171	0.033	0.88	0.40	0.99	0.79
11 <sup>th</sup>	PE 20:4;O/18:0	M-H	C43H78NO9P	1.99	782.5357	2.78	7.7	2.301	5.566	0.00 8	0.135	0.022	0.79	0.29	0.99	0.52
12 <sup>th</sup>	PE 22:2/PGE1	M+FA-H	C47H84NO11 P	1.13	914.5774	3.57	9.2	2.237	4.525	0.00 4	0.141	0.038	0.98	0.28	0.99	0.48
13 <sup>th</sup>	PC 16:0/20:4;O	M+FA-H	C44H80NO9P	2.59	842.5573	3.39	6.9	2.330	4.098	0.01 1	0.133	0.048	0.77	0.38	0.99	0.74
14 <sup>th</sup>	PS 22:4/PGE1	M+FA-H	C48H80NO13 P	-1.75	954.5333	2.85	7.7	2.227	4.802	0.00 8	0.142	0.033	0.79	0.30	0.99	0.53
15 <sup>th</sup>	PC 18:1;O/18:0	M+FA-H	C44H84NO9P	2.92	846.5889	3.57	9.1	1.586	3.960	0.00 4	0.214	0.052	0.97	0.23	0.99	0.34
16 <sup>th</sup>	PC 18:1;O/18:0	M+FA-H	C44H84NO9P	2.73	846.5888	3.73	8.9	1.812	3.744	0.00 4	0.184	0.059	0.99	0.22	0.99	0.32
18 <sup>th</sup>	PC 20:4;O/18:0	M+FA-H	C46H84NO9P	2.58	870.5887	3.67	8.5	2.320	5.070	0.00 5	0.134	0.029	0.90	0.36	0.99	0.70
19 <sup>th</sup>	PE 18:1;O/20:0	M-H	C43H82NO9P	3.16	786.5679	3.57	11.2	1.677	4.280	0.00 2	0.201	0.044	1.08	0.21	1	0.29
20 <sup>th</sup>	PE 18:1;O2/18:0	M-H2O-H	C41H80NO10 P	1.92	758.5356	2.65	9.1	1.756	4.070	0.00 4	0.191	0.049	0.85	0.21	0.99	0.30

21 <sup>st</sup>	PC 18:1;O/16:0	M+FA-H	C42H80NO9P	3.33	818.5578	2.27	6.5	1.485	4.217	<sup>0.01</sup> <sub>4</sub>	0.229	<b>0.045</b>	0.74	0.16	0.99	0.19
22 <sup>nd</sup>	PE 18:1;O/18:0	M-H2O-H	C41H80NO10 P	2.17	758.5358	2.85	8.1	2.174	3.976	<sup>0.00</sup> <sub>6</sub>	0.146	0.052	0.81	0.25	0.99	0.40
23 <sup>rd</sup>	PC 18:1;O/16:0	M+FA-H	C42H80NO9P	2.15	818.5569	2.65	8.9	1.990	3.738	<sup>0.00</sup> <sub>4</sub>	0.164	0.059	0.82	0.23	0.99	0.34
24 <sup>th</sup>	PC 18:1;O/16:0	M+FA-H	C42H80NO9P	2.19	818.557	2.85	8.5	1.796	3.616	<sup>0.00</sup> <sub>5</sub>	0.186	0.063	0.81	0.22	0.99	0.31
25 <sup>th</sup>	Prostaglandin D2	M-H	C20H32O5	-1.22	351.2173	0.4	12.2	5.561	7.504	<sup>0.00</sup> <sub>1</sub>	<b>0.022</b>	<b>0.008</b>	0.81	0.49	0.99	0.91
26 <sup>th</sup>	PC 20:3;O2/18:1	M+FA-H	C46H84NO9P	0.87	870.5873	4.33	9.2	2.273	4.724	<sup>0.00</sup> <sub>4</sub>	0.138	<b>0.034</b>	0.91	0.36	0.99	0.70
27 <sup>th</sup>	PC 20:3;O/18:0	M+FA-H	C46H84NO9P	3.1	870.5891	4	8.5	2.635	4.777	<sup>0.00</sup> <sub>5</sub>	0.111	<b>0.033</b>	0.92	0.41	0.99	0.81
28 <sup>th</sup>	PC 18:1;O/20:4	M+FA-H	C46H80NO9P	2.99	866.5577	2.64	9.0	2.959	3.898	<sup>0.00</sup> <sub>4</sub>	0.091	0.054	0.95	0.43	0.99	0.84
29 <sup>th</sup>	Epoxyeicosatrienoic acid	M-H	C20H32O3	-2.05	319.2272	0.59	7.0	3.244	3.373	<sup>0.01</sup> <sub>1</sub>	0.078	0.072	0.80	0.52	0.99	0.94
30 <sup>th</sup>	PC 18:1;O2/18:3	M+FA-H	C44H80NO10 P	2.94	858.5526	1.56	6.5	2.045	4.915	<sup>0.01</sup> <sub>4</sub>	0.159	<b>0.031</b>	0.51	0.32	0.94	0.60
32 <sup>nd</sup>	PC 20:4/18:1;O	M+FA-H	C46H80NO9P	3.09	866.5578	3.29	8.5	2.442	4.967	<sup>0.00</sup> <sub>5</sub>	0.124	<b>0.030</b>	0.91	0.36	0.99	0.68
33 <sup>rd</sup>	Am-Hex-PE O-36:5	M-H2O-H	C47H84NO12 P	3.22	866.5581	3.06	10.3	2.628	3.403	<sup>0.00</sup> <sub>2</sub>	0.111	0.071	1.01	0.38	0.99	0.75
35 <sup>th</sup>	PC 20:1;O	M-H2O-H	C28H54NO9P	-0.02	560.3358	0.65	15.2	1.243	3.702	<sup>0.00</sup> <sub>0</sub>	0.270	0.060	1.09	0.24	1	0.37
36 <sup>th</sup>	PE 38:4;O	M-H	C43H78NO9P	2.98	782.5365	4.1	11.5	2.296	2.830	<sup>0.00</sup> <sub>1</sub>	0.136	0.099	0.67	0.31	0.99	0.56

Eigenvector Rank	Metabolite	Adducts	Formula	Mass Error (ppm)	m/z measure d	Retention time (min)	BMI (F.val)	IPAQ (F.val)	Interaction n (F.val)	BMI (p)	IPA Q (p)	Interaction n (p)	BMI (E.S.)	IPA Q (p)	BMI (Power)	IPAQ (Power)
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37 <sup>th</sup>	DG 42:5;O2	M+Na-2H	C45H78O8	-2.17	767.5427	4.28	14.8	3.073	5.965	<sup>0.00</sup> <sub>0</sub>	0.086	<b>0.018</b>	0.96	0.35	0.99	0.66
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38 <sup>th</sup>	FA 22:5;O2	M-H2O-H	C22H34O4	-1.63	343.2273	0.5	8.2	3.476	1.410	0.00 6	0.068	0.241	0.93	0.57	0.99	0.97
39 <sup>th</sup>	PC 22:4/18:1;O	M+FA-H	C48H84NO9P	2.47	894.5887	3.57	10.8	3.382	3.074	0.00 2	0.072	0.086	1.08	0.43	1	0.83
40 <sup>th</sup>	PC 18:1;O/18:2	M+FA-H	C44H80NO9P	2.15	842.557	1.96	8.3	2.079	4.762	0.00 6	0.155	0.034	0.82	0.13	0.99	0.15
41 <sup>st</sup>	PS 20:3/22:0	M-H2O-H	C48H88NO10 P	2.85	850.5992	7.43	10.6	3.049	2.527	0.00 2	0.087	0.118	0.59	0.37	0.98	0.72
42 <sup>nd</sup>	PS 16:0/20:1	M+FA-H	C42H80NO10 P	0.81	834.5508	1.79	9.0	1.379	2.241	0.00 4	0.246	0.141	0.62	0.093	0.99	0.10
43 <sup>rd</sup>	MG 0:0/18:3/0:0	2M-H	C21H36O4	-0.29	703.5152	4.31	12.6	1.129	2.048	0.00 1	0.293	0.159	1.07	0.31	1	0.58
45 <sup>th</sup>	PG 38:3;O2	M+FA-H	C44H81O12P	3.24	877.5475	3.24	12.8	0.673	1.800	0.00 1	0.416	0.186	0.85	0.31	0.99	0.58
47 <sup>th</sup>	PC 20:4;O/20:0	M-H2O-H	C48H88NO9P	2.22	834.6037	8.38	10.9	2.464	3.730	0.00 2	0.123	0.059	0.82	0.25	0.99	0.39
48 <sup>th</sup>	PE 20:1/PGJ2	M-H2O-H	C45H78NO10 P	3.56	804.5214	4.47	8.1	0.768	0.085	0.00 6	0.385	0.772	0.50	0.46	0.93	0.88
49 <sup>th</sup>	PC 20:4/18:1	M-H	C46H82NO8P	2.54	806.5726	6.34	9.8	0.882	3.908	0.00 3	0.352	0.053	0.80	0.13	0.99	0.15
50 <sup>th</sup>	PC 40:7;O	M-H	C48H82NO9P	3.3	846.5682	5.21	9.3	2.152	0.021	0.00 4	0.149	0.885	0.48	0.49	0.90	0.92
52 <sup>nd</sup>	PE 20:0	M-H	C25H50NO8P	2.22	522.3213	0.98	7.7	2.620	2.386	0.00 8	0.112	0.129	0.42	0.51	0.82	0.93
53 <sup>rd</sup>	PE 38:3;O	M-H	C43H80NO9P	3.02	784.5522	6.63	6.7	1.979	0.091	0.01 2	0.166	0.764	0.54	0.46	0.96	0.88
54 <sup>th</sup>	PE 20:4/18:2	M-H. M+Na- 2H	C43H74NO8P	3.96	784.5452	4.31	11.1	0.842	2.802	0.00 2	0.363	0.100	0.87	0.20	0.99	0.27
55 <sup>th</sup>	PE 20:3;O/16:0	M-H	C41H76NO9P	2.51	756.5204	5.03	8.0	3.351	0.299	0.00 7	0.073	0.587	0.47	0.44	0.90	0.85
56 <sup>th</sup>	PS 18:0;O/20:0	M+Na-2H	C44H88NO9P	3.73	826.5973	7.83	8.7	1.024	1.469	0.00 5	0.316	0.231	0.47	0.44	0.90	0.85
58 <sup>th</sup>	PE 20:0/PGJ2	M-H2O-H	C45H80NO10 P	-0.48	806.5337	4.87	13.4	2.675	2.112	0.00 1	0.108	0.152	0.58	0.37	0.98	0.71

59 <sup>th</sup>	PC 18:1;O/16:1	M-H2O-H	C42H78NO9P	1.45	752.5247	4.33	10.7	0.307	5.727	0.00 2	0.582	0.020	0.76	0.12	0.99	0.13
60 <sup>th</sup>	PE 20:1;O	M-H2O-H	C25H48NO9P	0.41	518.289	0.56	6.3	0.211	3.030	0.01 5	0.648	0.088	0.51	0.27	0.51	0.46
62 <sup>nd</sup>	DG 32:1	M+FA-H	C35H66O5	2.83	611.4908	1.3	9.4	1.267	2.984	0.00 4	0.266	0.090	0.72	0.080	0.99	0.09
63 <sup>rd</sup>	FAHFA 34:4	M-H	C34H58O4	0.58	529.4265	3.22	7.5	0.096	2.174	0.00 8	0.758	0.146	0.72	0.289	0.99	0.51

Effect size (ES) can be trivial (< 0.19), small (0.2–0.59), moderate (0.6–1.19), large (1.2–1.99), and very large (> 2.0); Statistical power can be low (< 0.29), moderate (0.3–0.79), high (0.8 >);

DG: Diacylglycerol; FA: Docosanoid; FAHFA: Fatty Acyl esters of Hydroxy Fatty Acids; MG: Monoacylglycerol; PC: Phosphatidylcholine; PE: Phosphatidylethanolamine; PS: Phosphatidylserine; PG Phosphatidylglycerol; PI: Phosphatidylinositol

**Table S2.** Unidentified Compounds

Eigenvector Rank	Retention time (min)	m/z measured	BMI (F.val)	IPAQ (F.val)	Interaction (F.val)	BMI (p)	IPAQ (p)	Interaction (p)	BMI (E.S.)	IPAQ (E.S.)	BMI (Power)	IPAQ (Power)
17 <sup>th</sup>	3.2	901.5467	9.7	5.250	3.311	<b>0.003</b>	<b>0.026</b>	0.075	0.85	0.63	0.99	0.99
31 <sup>st</sup>	0.38	411.1968	6.6	3.556	4.187	<b>0.013</b>	0.065	<b>0.046</b>	0.59	0.39	0.98	0.77
34 <sup>th</sup>	4.28	834.5344	12.7	0.814	3.633	<b>0.001</b>	0.371	0.062	0.99	0.33	0.99	0.61
44 <sup>th</sup>	0.56	321.2386	7.2	7.732	1.095	<b>0.010</b>	<b>0.008</b>	0.300	0.77	0.70	0.99	0.99
46 <sup>th</sup>	0.86	562.3523	7.8	2.259	3.926	<b>0.007</b>	0.139	0.053	0.75	0.29	0.99	0.51
51 <sup>st</sup>	0.68	494.2889	8.5	2.740	2.194	<b>0.005</b>	0.104	0.145	0.38	0.51	0.74	0.94
57 <sup>th</sup>	6.34	808.5466	8.2	1.557	2.124	<b>0.006</b>	0.218	0.151	0.52	0.44	0.95	0.86
61 <sup>st</sup>	3.59	792.4982	8.1	0.004	0.087	<b>0.006</b>	0.952	0.770	0.76	0.074	0.99	0.08
64 <sup>th</sup>	9.63	816.6228	7.6	0.222	4.784	<b>0.008</b>	0.640	<b>0.033</b>	0.69	0.29	0.99	0.50

Effect size (ES) can be trivial (< 0.19), small (0.2–0.59), moderate (0.6–1.19), large (1.2–1.99), and very large (> 2.0); Statistical power can be low (< 0.29), moderate (0.3–0.79), high (0.8 >);

DG: Diacylglycerol; FA: Docosanoid; FAHFA: Fatty Acyl esters of Hydroxy Fatty Acids; MG: Monoacylglycerol; PC: Phosphatidylcholine; PE: Phosphatidylethanolamine; PS: Phosphatidylserine; PG Phosphatidylglycerol; PI: Phosphatidylinositol

Pearson coefficients of correlation between BMI, IPAQ and the 25 highest eigenvector centralities can be found in the Table S3.

**Table S3.** Coefficients of Pearson correlation among body mass index (BMI), index of physical activity questionnaire (IPAQ) and the plasma metabolites in the top 25 eigenvector rank of centralities

	Eigenvector Rank	1 <sup>st</sup>	2 <sup>nd</sup>	3 <sup>rd</sup>	4 <sup>th</sup>	5 <sup>th</sup>	6 <sup>th</sup>	7 <sup>th</sup>	8 <sup>th</sup>	9 <sup>th</sup>	10 <sup>th</sup>	11 <sup>th</sup>	12 <sup>th</sup>	13 <sup>th</sup>	14 <sup>th</sup>	15 <sup>th</sup>	16 <sup>th</sup>	17 <sup>th</sup>	18 <sup>th</sup>	19 <sup>th</sup>	20 <sup>th</sup>	21 <sup>st</sup>	22 <sup>nd</sup>	23 <sup>rd</sup>	24 <sup>th</sup>	25 <sup>th</sup>		
	BMI I	IPA Q	PC	PC	PE	PE	PS	PE	PGD 1	PG	PI	PS	PE	PC	PS	PC	PC	3.2 901.5m/z	PC	PE	PE	PC	PC	PC	PGD 2			
BMI	-	0,20	0,42	0,42	0,43	0,44	0,45	0,45	0,29	0,55	0,48	0,22	0,35	0,47	0,43	0,45	0,46	0,44	0,48	0,41	0,45	0,48	0,47	0,49	0,40	0,49	-0,06	
IPAQ	-	0,20	0,29	0,30	0,12	0,31	0,31	0,25	-0,20	0,39	0,28	0,22	0,20	0,24	0,30	0,25	0,29	0,33	-0,28	0,20	0,26	0,29	0,25	0,28	0,26	0,30	-0,01	
PC 36:4;O2	-	0,42	0,29	0,97	0,65	0,84	0,89	0,87	-0,70	0,71	0,95	0,42	0,86	0,89	0,96	0,91	0,84	0,94	-0,93	0,89	0,90	0,94	0,86	0,94	0,89	0,90	-0,43	
PC 20:4;O/16:0	-	0,42	0,30	0,97	-	0,67	0,82	0,88	0,86	-0,67	0,74	0,95	0,40	0,89	0,88	0,98	0,91	0,87	0,97	-0,94	0,89	0,90	0,95	0,86	0,95	0,90	0,89	-0,49
PE 20:3;O/18:0	-	0,43	0,12	0,65	0,67	-	0,57	0,61	0,61	-0,31	0,63	0,69	0,31	0,68	0,63	0,64	0,65	0,62	0,65	-0,68	0,66	0,64	0,68	0,56	0,68	0,57	0,63	-0,20
PE 20:2/PGE1	-	0,44	0,31	0,84	0,82	0,57	-	0,97	0,95	0,63	0,69	0,88	0,32	0,54	0,90	0,84	0,92	0,79	0,81	0,86	0,74	0,91	0,93	0,75	0,93	0,81	0,96	0,34
PS 22:4/PGE1	-	0,45	0,31	0,89	0,88	0,61	0,97	-	0,97	0,65	0,73	0,92	0,35	0,64	0,92	0,88	0,95	0,84	0,87	0,90	0,79	0,93	0,96	0,80	0,96	0,86	0,98	0,37
PE 20:2/PGE1	-	0,45	0,25	0,87	0,86	0,61	0,95	0,97	-	0,62	0,70	0,90	0,33	0,65	0,91	0,87	0,95	0,81	0,83	0,89	0,78	0,91	0,95	0,76	0,95	0,83	0,97	0,34
PGD1	-	0,29	0,20	0,70	0,67	0,31	0,63	0,65	0,62	-	0,48	0,67	0,24	0,55	0,64	0,69	0,65	0,65	0,67	0,65	0,57	0,65	0,67	0,59	0,67	0,69	0,65	0,40
PG 40:5;O2	-	0,55	0,39	0,71	0,74	0,63	0,69	0,73	0,70	-0,48	-	0,74	0,23	0,63	0,70	0,72	0,73	0,67	0,74	-0,71	0,63	0,72	0,77	0,61	0,77	0,71	0,74	-0,12
PI 20:3;O/18:1	-	0,48	0,28	0,95	0,95	0,69	0,88	0,92	0,90	0,67	0,74	-	0,38	0,81	0,93	0,94	0,96	0,91	0,94	0,99	0,85	0,94	0,97	0,89	0,98	0,94	0,93	0,37
PS 18:0/20:4	-	0,22	0,22	0,42	0,40	0,31	0,32	0,35	0,33	0,24	0,23	0,38	-	0,37	0,34	0,35	0,37	0,39	0,41	0,37	0,30	0,36	0,38	0,36	0,38	0,39	0,34	0,02
PE 20:4;O/18:0	-	0,35	0,20	0,86	0,89	0,68	0,54	0,64	0,65	-0,55	0,63	0,81	0,37	-	0,71	0,85	0,73	0,71	0,84	-0,79	0,85	0,72	0,77	0,75	0,77	0,76	0,66	-0,39
PE 22:2/PGE1	-	0,47	0,24	0,89	0,88	0,63	0,90	0,92	0,91	0,64	0,70	0,93	0,34	0,71	-	0,89	0,93	0,79	0,81	0,91	0,77	0,98	0,95	0,80	0,94	0,86	0,92	0,35
PC 16:0/20:4;O	-	0,43	0,30	0,96	0,98	0,64	0,84	0,88	0,87	-0,69	0,72	0,94	0,35	0,85	0,89	-	0,91	0,85	0,95	-0,93	0,87	0,90	0,94	0,84	0,94	0,87	0,89	-0,53
PS 22:4/PGE1	-	0,45	0,25	0,91	0,91	0,65	0,92	0,95	0,95	0,65	0,73	0,96	0,37	0,73	0,93	0,91	-	0,85	0,88	0,94	0,82	0,95	0,97	0,97	0,88	0,96	0,35	
PC 18:1;O/18:0	-	0,46	0,29	0,84	0,87	0,62	0,79	0,84	0,81	-0,65	0,67	0,91	0,39	0,71	0,79	0,85	0,85	-	0,90	-0,90	0,73	0,81	0,88	0,85	0,89	0,91	0,84	-0,39

PC 18:1;O/18:0	- 0,44	0,33	0,94	0,97	0,65	- 0,81	0,87	- 0,83	-0,67	0,74	- 0,94	0,41	0,84	- 0,81	0,95	- 0,88	0,90	- 0,93	0,88	- 0,83	- 0,92	0,87	- 0,92	0,90	- 0,87	-0,50
3,20 901,5m/z	0,48	- 0,28	- 0,93	- 0,94	- 0,68	0,86	0,90	0,89	0,65	- 0,71	0,99	0,37	- 0,79	0,91	- 0,93	0,94	- 0,90	- 0,93	- 0,84	0,93	0,96	- 0,87	0,96	- 0,93	0,91	-0,36
PC 20:4;O/18:0	- 0,41	0,20	0,89	0,89	0,66	- 0,74	- 0,79	- 0,78	-0,57	0,63	- 0,85	- 0,30	0,85	- 0,77	0,87	- 0,82	0,73	0,88	-0,84	- 0,79	- 0,86	0,76	- 0,86	0,79	- 0,81	-0,37
PE 18:1;O/20:0	0,45	- 0,26	0,90	0,90	- 0,64	0,91	0,93	0,91	0,65	- 0,72	0,94	0,36	- 0,72	0,98	- 0,90	0,95	- 0,81	0,83	0,93	- 0,79	0,96	- 0,81	0,96	- 0,88	0,94	0,35
PE 18:1;O2/18:0	0,48	- 0,29	0,94	0,95	- 0,68	0,93	0,96	0,95	0,67	- 0,77	0,97	0,38	- 0,77	0,95	- 0,94	0,97	- 0,88	0,92	0,96	- 0,86	0,96	- 0,85	1,00	- 0,91	0,97	0,37
PC 18:1;O/16:0	- 0,47	0,25	0,86	0,86	0,56	- 0,75	- 0,80	- 0,76	-0,59	0,61	- 0,89	- 0,36	0,75	- 0,80	0,84	- 0,82	0,85	0,87	-0,87	0,76	- 0,81	- 0,85	- 0,86	0,90	- 0,80	-0,47
PE 18:1;O/18:0	0,49	- 0,28	0,94	0,95	- 0,68	0,93	0,96	0,95	0,67	- 0,77	0,98	0,38	- 0,77	0,94	- 0,94	0,97	- 0,89	0,92	0,96	- 0,86	0,96	1,00	- 0,86	- 0,92	0,97	0,37
PC 18:1;O/16:0	- 0,40	0,26	0,89	0,90	0,57	- 0,81	- 0,86	- 0,83	-0,69	0,71	- 0,94	- 0,39	0,76	- 0,86	0,87	- 0,88	0,91	0,90	-0,93	0,79	- 0,88	- 0,91	0,90	- 0,92	- 0,86	-0,37
PC 18:1;O/16:0	0,49	- 0,30	0,90	0,89	- 0,63	0,96	0,98	0,97	0,65	- 0,74	0,93	0,34	- 0,66	0,92	- 0,89	0,96	- 0,84	0,87	0,91	- 0,81	0,94	0,97	- 0,80	0,97	- 0,86	0,35
PGD2	- 0,06	- 0,01	- 0,43	- 0,49	- 0,20	0,34	0,37	0,34	0,40	- 0,12	0,37	0,02	- 0,39	0,35	- 0,53	0,35	- 0,39	0,50	0,36	- 0,37	0,35	- 0,37	0,47	- 0,37	0,35	

Significant correlation ( $p<0.05$ ) is displayed in red. Coefficient values can be very small (0-0.9), small (0.1-0.29), moderate (0.3-0.49), large (0.5-0.69), very large (0.7-0.8) and nearly perfect (0.9-0.99) and perfect (1.00)

#### 4. CONCLUSÃO

Pode-se analisar que o presente projeto possibilitou a obtenção de diferentes achados representativos para a saúde humana quando avaliados a partir da premissa da abordagem da Esportômica por redes complexas. Conforme demonstrado no artigo científico do Capítulo I, a maior parte dos achados foram espécies oxidadas de fosfolipídios. A maioria das espécies de fosfatidilcolinas e uma espécie de fosfatidilglicerol foram encontradas diminuídas em indivíduos obesos, enquanto a maioria das espécies de fosfatidiletanolamina, fosfatidilserina e um fosfatidilinositol foram aumentados nos organismos dos indivíduos. Apenas uma espécie de prostaglandina, fosfatidilglicerol e fosfatidilinositol apresentaram alterações quando correlacionados à influência do IPAQ mas, os efeitos de interação entre IMC e IPAQ foram encontrados para a maioria dos metabólitos na combinação de IMC obeso com IPAQ baixo. Um achado notável foi o aumento da abundância plasmática de Prostaglandina D1 em indivíduos obesos, enquanto os níveis de Prostaglandina D2 foram maiores no grupo IPAQ alto. Outro resultado significativo foi o aumento da abundância de duas espécies de fosfatidilserina no grupo obeso. O fosfatidilglicerol merece atenção especial, pois foi o único composto plasmático afetado tanto pelo IMC quanto pelo IPAQ de forma independente, bem como pela interação entre IMC com sobrepeso/obesidade e IPAQ baixo.

Apesar das limitações do presente trabalho, pode-se levar em consideração que os achados demonstrados no presente projeto exploratório possibilitam inferir certas evidências moleculares importantes da relação combinada entre IMC e IPAQ através da determinação de metabólitos plasmáticos, permitindo deste modo, extrapolar tais achados de maneira direcionada em pesquisas futuras e, favorecendo deste modo, uma individualização na saúde de indivíduos obesos.

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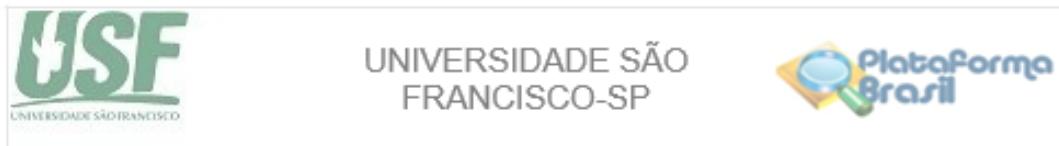
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## ANEXOS

### Anexo I – Aprovação Comitê de Ética em Pesquisa (CEP)



#### PARECER CONSUBSTANCIADO DO CEP

##### DADOS DO PROJETO DE PESQUISA

**Título da Pesquisa:** Relação entre ingestão de ácidos graxos ômega 3 e perfil lipídico em voluntários adultos saudáveis

**Pesquisador:** Patricia de Oliveira Carvalho

**Área Temática:**

**Versão:** 2

**CAAE:** 12087719.5.0000.5514

**Instituição Proponente:** Universidade São Francisco-SP

**Patrocinador Principal:** Financiamento Próprio

##### DADOS DA NOTIFICAÇÃO

**Tipo de Notificação:** Outros

**Detalhe:** Engano do parecer

**Justificativa:** Prezados, solicito averiguar o conteúdo do parecer referente a Emenda do projeto

**Data do Envio:** 23/09/2019

**Situação da Notificação:** Parecer Consustanciado Emitido

##### DADOS DO PARECER

**Número do Parecer:** 3.601.407

##### Apresentação da Notificação:

Notificação apresentada para averiguação de conteúdo de parecer.

##### Objetivo da Notificação:

Solicitar esclarecimentos sobre parecer emitido pelo CEP.

##### Avaliação dos Riscos e Benefícios:

Não se aplica.

##### Comentários e Considerações sobre a Notificação:

A presente notificação questiona acerca de parecer referente a Emenda do projeto CAAE 12087719.5.0000.5514 emitida no último dia 19.09.2019. No entanto, cabe o esclarecimento de que ocorreu um erro na plataforma Brasil no momento de criação de parecer consustanciado, sendo que na relatoria apresentada ao CEP (submetida dia 18/9/2019), a emenda encontra-se

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Telefone: (11)2454-8981

E-mail: comiteetica@usf.edu.br



Continuação do Parecer: 3.601.407

aprovada sem observação de óbices éticos que poderiam impedir o prosseguimento da proposta.

**Considerações sobre os Termos de apresentação obrigatória:**

Termos apresentados adequadamente.

**Conclusões ou Pendências e Lista de Inadequações:**

Não foram observados óbices éticos. Emenda apresentada anteriormente pelo proponente encontra-se adequado e as informações que constam no arquivo como questionamentos são resultado de um problema do sistema e não da proposta.

**Considerações Finais a critério do CEP:**

APÓS REUNIÃO DO DIA 19/09/2019, O COLEGIADO DELIBEROU PELA APROVAÇÃO DA EMENTA SUBMETIDA.

**Este parecer foi elaborado baseado nos documentos abaixo relacionados:**

Tipo Documento	Arquivo	Postagem	Autor	Situação
Outros	AnuenciaUNIFAG.pdf	23/09/2019 09:06:16	Patricia de Oliveira Carvalho	Postado

**Situação do Parecer:**

Aprovado

**Necessita Apreciação da CONEP:**

Não

BRAGANCA PAULISTA, 26 de Setembro de 2019

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**Assinado por:**  
**Mário Angelo Claudino**  
**(Coordenador(a))**

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## Anexo II – Questionário Internacional de Atividade Física (IPAQ)

### – FORMA CURTA –

Nome: \_\_\_\_\_

Data: \_\_\_\_/\_\_\_\_/\_\_\_\_ Idade: \_\_\_\_\_ Sexo: F ( ) M ( )

Você trabalha de forma remunerada: ( ) Sim ( ) Não

Quantas horas você trabalha por dia: \_\_\_\_\_

Quantos anos completos você estudou: \_\_\_\_\_

De forma geral sua saúde está:

( ) Excelente ( ) Muito boa ( ) Boa ( ) Regular ( ) Ruim

Nós estamos interessados em saber que tipos de atividade física as pessoas fazem como parte do seu dia a dia. Este projeto faz parte de um grande estudo que está sendo feito em diferentes países ao redor do mundo.

Suas respostas nos ajudarão a entender que tão ativos nós somos em relação a pessoas de outros países. As perguntas estão relacionadas ao tempo que você gasta fazendo atividade física em uma semana NORMAL, USUAL ou HABITUAL. As perguntas incluem as atividades que você faz no trabalho, para ir de um lugar a outro, por lazer, por esporte, por exercício ou como parte das suas atividades em casa ou no jardim. Suas respostas são MUITO importantes. Por favor, responda cada questão mesmo que considere que não seja ativo. Obrigado pela sua participação!

Para responder as questões lembre que:

- atividades físicas VIGOROSAS são aquelas que precisam de um grande esforço físico e que fazem respirar MUITO mais forte que o normal
- atividades físicas MODERADAS são aquelas que precisam de algum esforço físico e que fazem respirar UM POUCO mais forte que o normal

Para responder as perguntas pense somente nas atividades que você realiza por pelo menos 10 minutos contínuos de cada vez:

1a. Em quantos dias de uma semana normal, você realiza atividades VIGOROSAS por pelo menos 10 minutos contínuos, como por exemplo correr, fazer ginástica aeróbica, jogar futebol, pedalar rápido na bicicleta, jogar basquete, fazer serviços domésticos pesados em casa, no quintal ou no

jardim, carregar pesos elevados ou qualquer atividade que faça você suar BASTANTE ou aumentem MUITO sua respiração ou batimentos do coração.

dias \_\_\_\_ por SEMANA      ( ) Nenhum

1b. Nos dias em que você faz essas atividades vigorosas por pelo menos 10 minutos contínuos, quanto tempo no total você gasta fazendo essas atividades por dia? horas: \_\_\_\_\_ Minutos: \_\_\_\_\_

2a. Em quantos dias de uma semana normal, você realiza atividades MODERADAS por pelo menos 10 minutos contínuos, como por exemplo pedalar leve na bicicleta, nadar, dançar, fazer ginástica aeróbica leve, jogar vôlei recreativo, carregar pesos leves, fazer serviços domésticos na casa, no quintal ou no jardim como varrer, aspirar, cuidar do jardim, ou qualquer atividade que faça você suar leve ou aumentem moderadamente sua respiração ou batimentos do coração (POR FAVOR NÃO INCLUA CAMINHADA)

dias \_\_\_\_ por SEMANA      ( ) Nenhum

2b. Nos dias em que você faz essas atividades moderadas por pelo menos 10 minutos contínuos quanto tempo no total você gasta fazendo essas atividades por dia?

horas: \_\_\_\_\_ Minutos: \_\_\_\_\_

3a. Em quantos dias de uma semana normal você caminha por pelo menos 10 minutos contínuos em casa ou no trabalho, como forma de transporte para ir de um lugar para outro, por lazer, por prazer ou como forma de exercício?

dias \_\_\_\_ por SEMANA      ( ) Nenhum

3b. Nos dias em que você caminha por pelo menos 10 minutos contínuos quanto tempo no total você gasta caminhando por dia?

horas: \_\_\_\_\_ Minutos: \_\_\_\_\_

4a. Estas últimas perguntas são em relação ao tempo que você gasta sentado ao todo no trabalho, em casa, na escola ou faculdade e durante o tempo livre. Isto inclui o tempo que você gasta sentado no escritório ou estudando, fazendo lição de casa, visitando amigos, lendo e sentado ou deitado assistindo televisão.

Quanto tempo por dia você fica sentado em um dia da semana?

horas: \_\_\_\_\_ Minutos: \_\_\_\_\_

4b. Quanto tempo por dia você fica sentado no final de semana?

horas: \_\_\_\_\_ Minutos: \_\_\_\_\_

### Anexo III – Comprovante de Aceite do Artigo para Publicação



Mayara Lambert <mayaralambert93@gmail.com>

#### [Biology] Manuscript ID: biology-3068015 - Accepted for Publication

1 mensagem

**Biology Editorial Office** <biology@mdpi.com>

12 de julho de 2024 às 03:12

Responder a: Iulian Vlad Stan <stan@mdpi.com>, Biology Editorial Office <biology@mdpi.com>

Para: ivan gustavo masselli dos reis <ivan.reis@usf.edu.br>

Cc: Mayara Lambert <mayaralambert93@gmail.com>, Larissa de Castro Pedroso <larissa.pedroso@usf.edu.br>, Álex Aparecido Rosini Silva <alex.rosini@mail.usf.edu.br>, Leonardo Henrique Dalcheco Messias <leonardo.messias@usf.edu.br>, "Andréia M. Porcari" <andreia.porcari@usf.edu.br>, Patricia de Oliveira Carvalho <patricia.carvalho@usf.edu.br>, Pedro Paulo de Menezes Scariot <pedro.scariot@mail.usf.edu.br>, Biology Editorial Office <biology@mdpi.com>, Iulian Vlad Stan <stan@mdpi.com>

Dear Professor dos Reis,

Congratulations on the acceptance of your manuscript, and thank you for submitting your work to Biology:

Manuscript ID: biology-3068015

Type of manuscript: Article

Title: COMBINED MODULATION OF PLASMA METABOLITES BY THE BODY MASS INDEX AND PHYSICAL ACTIVITY LEVEL

Authors: Mayara Lambert, Larissa de Castro Pedroso, Álex Aparecido Rosini Silva, Leonardo Henrique Dalcheco Messias, Andréia M. Porcari, Patricia de Oliveira Carvalho, Pedro Paulo de Menezes Scariot, Ivan Gustavo Masselli dos Reis \*

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Kind regards,  
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