1 DIFFERENTIAL ANALYSIS OF GENE EXPRESSION IN SEVERELY SICK COVID-19

2 **PATIENTS**.

3 Background:

4 This study investigates differential gene expression in severely sick COVID-19 patients to 5 elucidate molecular mechanisms driving disease progression. Using transcriptomic data from 44 severe COVID-19 patients and 10 healthy individuals (NCBI GEO: GSE171110), we 6 7 analyzed whole blood samples via DESeq2, identifying 737 differentially expressed genes 8 (DEGs). Of these, 662 were upregulated (e.g., inflammatory and antiviral pathways) and 75 9 downregulated. Principal component analysis (PCA) and heatmaps revealed distinct 10 transcriptional signatures between groups, highlighting immune dysregulation. Key 11 upregulated pathways included Jak-STAT, MAPK, PI3K-Akt, Toll-like receptor, and TNF 12 signaling, associated with cytokine storms, neutrophil activation, and oxidative stress. MHC class I genes (linked to CD8+ T-cell and NK-cell cytotoxicity) were elevated, while MHC class 13 II (involved in CD4+ T-cell cytokine production) was suppressed. Pro-inflammatory 14 interleukins (IL-1β, IL-6, IL-12) and antiviral IFN-β were also upregulated, indicating 15 heightened inflammation and antiviral responses. Conversely, DNA repair pathways were 16 17 disrupted. The findings suggest severe COVID-19 involves hyperactivation of innate 18 immunity and cytotoxic T-cell responses, coupled with impaired adaptive immunity (reduced 19 CD4+ T-cell function). These mechanisms likely contribute to tissue damage and cytokine 20 release syndrome. The study underscores the role of transcriptional dysregulation in driving 21 severe outcomes, offering insights into potential therapeutic targets to modulate immune 22 responses.

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24 Introduction: Covid-19 caused by the novel coronavirus (SARS-CoV-2), Over 760 million 25 cases and 6.9 million deaths have been recorded worldwide since December 2019, but the 26 actual number is thought to be higher (1). Patients with this disease have very variable clinical 27 pictures, ranging from the absence of symptoms to respiratory deficiency, which progressively 28 leads to death. Studies have postulated that the immune response is fundamental in the 29 progression of this disease. When the immune system fails to control the virus efficiently in 30 the acute stage, a macrophage activation syndrome can develop that causes the flow of a cascade of cytokines that lead the patient to a critical or severe state (2). However, it is still 31 32 not completely known how these mechanisms are carried out, nor the variables that trigger 33 the severe condition, which occurs in a small percentage of these patients (3). Therefore, for

a greater understanding of the disease it is necessary to study the cellular pathways and the
 transcriptional response to infection in the host cells. In order to clarify the signaling pathways
 affected in the severe state of patients, the present work proposes the analysis of the
 transcriptome of whole blood samples from patients with severe COVID-19 in comparison
 with apparently healthy individuals.

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Objective: To analyze the transcriptional profile in whole blood samples from healthy
 individuals and patients with severe Covid-19 to compare and analyze the pathways involved
 in patients with this disease.

Methodology: Transcriptomic data were obtained in the form of pre-processed count 43 44 matrices (aligned and filtered readings, not normalized) from the NCBI Gene Expression 45 Omnibus (GEO) platform (https://www.ncbi.nlm.nih.gov/geo/. Accession number: GSE171110) (4), which were represented by 54 samples, of which 44 were from patients with severe 46 47 Covid-19 and 10 healthy individuals. The counting matrix was imported by the DESeqDataSetFromMatrix function of the DESeq2 package (v1.32.0), it contained 30,185 48 transcribed genes. All normalized transcripts with a maximum mean of all rows less than 10 49 50 were excluded, resulting in 24,099 transcripts present. And again with DESeg2, the set of differentially expressed genes was calculated (severe COVID-19 versus Healthy Individuals), 51 52 the p-value used was 0.05, and a FC of 1. The variance stabilization transformation (VST) and Log2 were used for the calculation of normalized counts of each transcript. With all the 53 54 transcripts present, a principal component analysis was performed. The most variable 55 transcripts were visualized on a heat map. And an analysis of differentially expressed 56 pathways was performed using the KEGG package.

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Results and Discussion: The differential expression analysis for the 24,092, with p-value < 0.05 and FC = 1, yielded a total of 737 differentially expressed genes (Figure 1A), of which 662 (2.7%) were positively regulated (LFC > 1.00), while 75 (0.31%) were negatively regulated (LFC < -1.00). Both in the analysis of main components (Figure 1B) and in the heat map (Figure 1C) it can be observed that the samples of patients with "Severe COVID-19" present a differentially expressed gene signature different from that of the samples provided by the "Healthy Individuals".

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Figure 1. A. log2 shift volcano diagram, differentially expressed genes are shown in blue color.

B. Main component graph C. Heat map of differential gene expression between COVID-19

patients and healthy donors (each column represents a different sample, the rows represent

different genes; the color represents the level of gene expression: red indicates a positive

gene expression in the sample and blue indicates a negative gene expression in the sample.







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Through the analysis of differentially expressed pathways, it was observed the positively
regulated expression of the Jak-STAT, MAPK, PI3K-Akt, and PLCy signaling pathways,
activated by the chemokine/cytokine receptor, so that cellular functions such as proliferation,
cell differentiation, apoptosis, cell migration, and ubiquitination-mediated proteolysis are
altered. There is production of reactive oxygen species and which in turn produces
dysregulation of the DNA mismatch repair (MMR) system (5).

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At the level of immunity, positively regulated expression of the MHCI was observed, which 84 triggers the CD8 T lymphocyte response and regulates the activity of NK cells, which function 85 as inducers of cell death. On the other hand, the MHCII showed negatively regulated 86 87 expression, as well as the activity of CD4 T lymphocytes, which act in the production of cytokines (Figure 2). In addition, there is a strong regulation of positive expression in genes 88 associated with the inflammatory response, which includes the Toll-Like receptor signaling 89 pathway, the TNF signaling pathway, pro-inflammatory interleukins: IL-1b, IL-6, IL-12, which 90 also plays an important role in the recruitment, function and survival of neutrophils (6). On the 91 92 other hand, positive expression of IFN- β , which functions as a mediator of the antiviral 93 response, was observed (Figure 3).

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95 96 97 **Figure 3.** Signaling pathway of the Toll-Like receptor.

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99 Gene expression studies conducted on blood samples from COVID-19 patients indicated that 100 genes associated with inflammatory and hypercoagulability pathways (7) and the imbalance 101 between innate and adaptive immune responses are the main factors responsible for severe 102 disease course (8). Thair et al (9) found a differential transcriptomic pattern in blood that 103 differentiated COVID-19 patients from other viral infections, suggesting that their top 104 differentially expressed genes (DEGs) may be linked to new mechanisms of pathogen 105 evasion from host immune response. Most recently, Aschenbrenner et al. (10) revealed 106 neutrophil activation signatures in severe cases, coupled with an elevated expression of 107 genes related to coagulation and platelet function, and absence of T-cell activation. 108 Considering the ability of coronavirus infections, particularly SARS-CoV-2 infections, to induce 109 inflammation and lung injury and also the similarity of this novel virus to MERS-CoV and 110 SARS-CoV in its ability to infect lung epithelial cells, it is expected that this emerging life-111 threatening coronavirus utilizes some of the same cellular signaling pathways as MERS-CoV 112 and SARS-CoV. As a therapeutic approach, the use of anti-inflammatory agents during 113 COVID-19 to affect inflammatory signaling pathways might be beneficial for reducing the severity of the disease (11). The NF- κ B, cytokine regulation, ERK, and TNF- α signaling 114 115 pathways have been shown to be likely causes of inflammation in MERS-CoV and SARS-CoV infections, with neutrophilia and basophilia exacerbating the disease in SARS patients 116 117 [210]. The increased levels of inflammatory cytokines in serum of COVID-19 patients have 118 shed light on the involvement of such signaling pathways in the pathogenesis infection of 119 SARS-CoV-2. Further studies are needed to clarify the exact roles of cellular signaling 120 pathways once the SARS-CoV-2 initiates infection in its host cell. Also, researchers in 121 molecular medicine should consider the roles of the most strongly up- and downregulated 122 components of cellular signaling pathways during COVID-19 to identify and design better 123 molecular drugs that will decrease the fatality rate of this novel pandemic coronavirus. The findings suggest severe COVID-19 involves hyperactivation of innate immunity and 124 125 cytotoxic T-cell responses, coupled with impaired adaptive immunity (reduced CD4+ T-cell 126 function). These mechanisms likely contribute to tissue damage and cytokine release syndrome. The study underscores the role of transcriptional dysregulation in driving severe 127 128 outcomes, offering insights into potential therapeutic targets to modulate immune responses. 129

- 130 **Conclusion:** In the severe state of SARS-CoV-2 viral infection, differential gene expression is
- 131 represented, genes mainly involved in signaling pathways with CD8 T lymphocyte recruitment,
- 132 pro-inflammatory, cell cycle alteration, and antiviral response functions.
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- 134 **Competing Interests:-** The authors declare that they have no financial or nonfinancial
- 135 competing interests.
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