## **Bioinformatics analysis of mutations in SARS-CoV-2 and clinical phenotypes**

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**Background:** Severe acute respiratory syndrome coronavirus 2 (SARS-CoV-2), initially reported in Wuhan (China) has spread worldwide. Like other viruses, SARS-CoV-2 accumulates mutations with each cycle of replication by continuously evolving a viral strain with one or more single nucleotide variants (SNVs). However, SNVs that cause severe COVID-19 or lead to immune escape or vaccine failure are not well understood. We aim to identify SNVs associated with severe clinical phenotypes.

**Methods**: In this study, 27429 whole-genome aligned consensus sequences of SARS-CoV-2 were collected from genomic epidemiology of SARS-CoV-2 project in Spain (SeqCOVID)<sup>1</sup>. These samples were obtained from patients who required hospitalization and/or intensive care unit admission (ICU), excluding those registered in the first pandemic wave. Besides, 248 SARS-CoV-2 genomes were isolated from COVID-19 hospitalized patients from Gregorio Marañon General University Hospital (GMH) of which 142 were fully vaccinated. Bioinformatics tools using R and Python programming languages were developed and implemented comparing those to SARS-CoV-2 Wuhan-Hu-1 (reference genome).

**Results**: Using a selection threshold mutational frequency 10%, 27 SNVs were expected to have association with hospitalization and ICU risk. The reference haplotype differing at the SNV coding for lysine at the residue 203 (N:R203K) was found to have negative association with COVID-19 hospitalization risk ( $p = 5.37 \times 10^{-04}$ ). Similarly a negative association was observed when the residue at 501 is replaced by tyrosine (S:N501Y) ( $p = 1.33 \times 10^{-02}$ ). The application of a Chi-square test suggested that SNV-haplotypes coding for mutants residues such as (S:A222V, N:A220V, ORF10:V30L) and (ORF1a:T1001I, ORF1a:I2230T, S:N501Y, S:T716S, S:S982A, ORF8:Q27\*, N:R203K, N:S235F) have negative associations with COVID-19 hospitalization risk ( $p = 6.58 \times 10^{-07}$  and  $p = 2.27 \times 10^{-16}$ , respectively) and COVID-19 ICU risk ( $p = 1.15 \times 10^{-02}$  and  $p = 2.51 \times 10^{-02}$ , respectively). Focusing on the SNV-haplotype coding the mutations (S:A222V, N:A220V, N:D377Y, ORF10:V30L) were observed to increase the risk of COVID-19 hospitalization ( $p = 2.71 \times 10^{-04}$ ). Results from SARS-COV-2 genomes analysis from GMH showed 63 coding SNVs which met the established threshold value. Applying a Chi-square test, the SNV-haplotype carrying coding variants for mutant residues in 5 ORF proteins and surface and membrane glycoprotein and nucleocapsid phosphoprotein was significantly associated with vaccine failure in hospitalized COVID-19 patients ( $p = 7.91 \times 10^{-04}$ ).

**Conclusions**: SNV-haplotypes carrying variants lead to non-synonymous mutations located along SARS-CoV-2 whole-proteome may influence COVID-19 severity and vaccine failure suggesting a functional role in the clinical outcome for COVID-19 patients.

<sup>&</sup>lt;sup>1</sup> https://seqcovid.csic.es/