



Article

Characterization of Structural and Energetic Differences between Conformations of the SARS-CoV-2 Spike Protein

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Abstract: The novel coronavirus disease 2019 (COVID-19) pandemic has disrupted modern societies and their economies. The resurgence in COVID-19 cases as part of the second wave is observed across Europe and the Americas. The scientific response has enabled a complete structural characterization of the Severe Acute Respiratory Syndrome—novel Coronavirus 2 (SARS-CoV-2). Among the most relevant proteins required by the novel coronavirus to facilitate the cell entry mechanism is the spike protein. This protein possesses a receptor-binding domain (RBD) that binds the cellular angiotensin-converting enzyme 2 (ACE2) and then triggers the fusion of viral and host cell membranes. In this regard, a comprehensive characterization of the structural stability of the spike protein is a crucial step to find new therapeutics to interrupt the process of recognition. On the other hand, it has been suggested that the participation of more than one RBD is a possible mechanism to enhance cell entry. Here, we discuss the protein structural stability based on the computational determination of the dynamic contact map and the energetic difference of the spike protein conformations via the mapping of the hydration free energy by the Poisson–Boltzmann method. We expect our result to foster the discussion of the number of RBD involved during recognition and the repurposing of new drugs to disable the recognition by discovering new hotspots for drug targets apart from the flexible loop in the RBD that binds the ACE2.

Keywords: SARS-CoV-2; spike protein; RBD; conformational space; structural stability; solvation energy; native contacts

1. Introduction

Previous outbreaks of coronaviruses have threatened our modern societies [1,2]. However, neither of them stressed the worldwide health system and economy [3] more than the novel coronavirus. As of 30 October 2020, almost 45 million confirmed cases with a death toll over one million around the world have been reported. Thus, there is an urgent need to understand the molecular features of each of the proteins that are assembled into the virion. The fast spread of COVID-19 around the globe urges to devise viral deactivation strategies prior to cell recognition or block the viral replication mechanism, among others [4]. A key component in all coronavirus associated with cell entry is the

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spike protein (S) and, thus, its structural characterization is an essential step [5,6]. The typical spike protein is a homotrimer system and it plays a crucial role in the interaction between the virion and the host human cell membranes. The spike protein attaches itself to specific cellular receptors (i.e., human angiotensin-converting enzyme—ACE2) [7,8] and recently [9], it has been proposed that it can bind to nicotinic acetylcholine receptors (nAChRs) through the S protein. Such studies suggested that the S protein could favor binding to nAChR and avoid cell entry via the ACE2 receptor in the presence of nicotine. In the case of ACE2 receptor, the spike protein undergoes several conformational changes that engage different protein domains (e.g., receptor binding domain-(RBD), N-terminal domain-NTD, and S1 and S2 subunits) (see Figure 1). The first process that is believed to occur relates to the transition from down to up receptor-binding domain conformation. This transition prepares the virus for binding to the ACE2 receptor and the subsequent internalization of the virus through the formation of the endosome, later fusion of the viral and cell membranes, and the final release of the viral RNA into the cytoplasm [10]. It is clear that the spike protein is a crucial component in each aspect of the cell entry mechanism. Several studies [5,11–15] have elucidated how the novel coronavirus takes advantage of the spike protein structure to outperform SARS-CoV. For instance, the characterization of the mechanical stability of the RBD of Acute Respiratory Syndrome—novel Coronavirus 2 (SARS-CoV-2) has shown it to be stiffer (greater by 50 pN) compared to SARS-CoV [16]. This result has important consequences during binding to ACE2 (pre-fusion state) [17], as it can withstand Brownian and cellular forces and yet maintains close contact while priming of the spike protein by transmembrane protease serine 2 (TMPRSS2) occurs as part of S1 dissociation from S2 that enables the post-fusion mechanism [17,18]. In addition, in silico studies found a space correlation between the polybasic furin cleavage site Q₆₇₇TNSPRRAR↓SV₆₈₇ and surface residues located in the RBD region that recognize the ACE2 in SARS-CoV-2. Such effect was mediated by a long-range electrostatic interaction 10 nm apart [19]. Furthermore, the mutant D614G (a single residue change, D = aspartic acid by G = glycine) of the SARS-CoV-2 spike protein sequence, which became the dominant form globally at the end of March, displayed stronger transmissibility [20]. Also, this mutation correlated residues that are located about 7-10 nm from the SARS-CoV-2 RBD [19]. Certainly, it has also been suggested that those features in the spike protein could enhance its transmissibility and facilitate the post-fusion machinery in SARS-CoV-2 [21]. The intrinsic flexibility of the full ectodomain dictated by three hinges was characterized by cryo-electron microscopy (cryo-EM) and large-scale molecular dynamics (MD) simulation [22]. It shows the flexibility of the spike protein and the ability of the spike head to explore different orientations in space which allows it to scan the host cell surface in search of ACE receptors. A recent cryo-EM study has found a free fatty acid (FFA) pocket in each RBD [23]. The binding of the FFA linoleic acid stabilizes a locked conformation giving rise to reduced ACE2 interaction in vitro. The sugar coating of the surface in the spike protein by glycans are not only shielding to evade the immune system response as commonly believed [24], but also they may play a structural role by modulating the conformational dynamics of the spike's RBD that is responsible for cell recognition [25].

In order to fight against COVID-19, several medical strategies have been developed (e.g., vaccines and monoclonal antibodies) [26–28]. New efforts in novel therapeutics employing short peptides, proteins, and natural resources, such as plant derivatives, are yet new ways for disabling the virion at the level of the spike protein [29–32]. In this regard, a stabilized form of spike protein with all RBD in down or one (or two) RBD in the up conformation is desirable for vaccine and therapeutic development because this conformation displays most of the neutralizing epitopes that can be targeted by antibodies to prevent cell entry [6,33]. These stabilized structures contain two consecutive proline substitutions in the S2 subunit in a turn between the central helix (CH) and heptad repeat 1 (HR1) that is important during the transition to a single, elongated α -helix in the post fusion conformation. Prefusion-stabilized spikes in closed and open states have been used to determine high-resolution spike structures by cryo-EM [5,7] that has been crucial for large-scale MD simulation restricted to a microsecond time scale. However, even with these substitutions, the SARS-CoV-2 ectodomain is unstable without the ACE2 receptor and typically difficult to express on mammalian

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cells, hampering biochemical research and search for novel vaccines. A recent single-molecule Förster Resonance Energy Transfer (smFRET) study characterizes the ensemble of conformations occurring in the spike which seems to be part of a dynamic equilibrium [34], but it does not lead to a quantitative assessment of the relative stability between conformers. A multiscale modeling that employs structure-based coarse-graining has shown the existence of a dynamic asymmetry that triggers the change in conformation of the closed to open states and the characteristic free-energy landscape shows the closed conformation as the ground state [34,35]. Here, we show an analysis of the relative stability considering dynamic contact map analysis. Our study shows the correlation between different conformations of the spike protein and its RBD, NTD, and S2 subunits and highlights the role of destabilization in order to get access to other conformations. This tool also allows determination of stable "hotspots" across the amino acid sequences and possible new targets for therapeutics. In addition, we obtain free energy differences between states of the spike protein without ACE2.

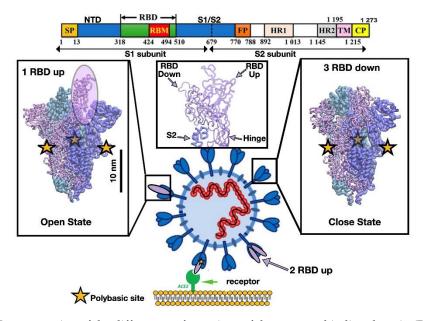


Figure 1. Representation of the different conformations of the receptor-binding domain (RBD) in the Acute Respiratory Syndrome—novel Coronavirus 2 (SARS-CoV-2) spike protein. Cell recognition is initiated by the RBD remaissible from about to up a conformation that that dives the RBD remaissible from about to up a conformation that the about the Phan. A lacrosad to fetue high lacfinity believity believity believity believity believity that the RBD production and the mangiother singioteves ting and produced by the children of the RBD production and the mangiother singioteves ting and production of the singioteves ting and production of the singioteves ting and production of the synthesis of the production of the synthesis of the

2. Materials and Methods in order to fight against COVID-19, several medical strategies have been developed (e.g., vaccines and monoclonal antibodies), [26-28]. New efforts in novel therapeutics employing short peptides, proteins, and natural resources, such as plant derivatives, are yet new ways for disabling the vTherSARRE-PeVe7 spike (S): proteiner of protein for the slope desired and in the slope of states in spike of the contract with all RBD in down conformation and prothone outworks and hard increasing the children. energymatical velocitied accressor this three RRP on the idown as estime (adown) zinge BRD in the um voctavet BBD in the down to opitional (Leur 2 down) and two BBD in the unranding BBD in the donseconsition (Rup I down) utilhe unwave so constructed based belower EME steneral green the Protein Reproduced CRIPP) - modernal Vis XmpV stane and 16X2 the especitively to Several, important learns in the epide pustein were modeled pased son the structure pakthe iRBD beand with AC states enterwite PDB code 6MeInThe might resolution trustices are fully some letem family file has been extruction have been empl simulation restricted to a microsecond time scale. However, even with these substitutions, the SARS-CoV-2 ectodomain is unstable without the ACE2 receptor and typically difficult to express on mammalian cells, hampering biochemical research and search for novel vaccines. A recent singlemolecule Förster Resonance Energy Transfer (smFRET) study characterizes the ensemble of conformations occurring in the spike which seems to be part of a dynamic equilibrium [34], but it Materials **2020**, 13, 5362 4 of 14

for each starting conformation. The wild-type (WT) sequences that describe the spike protein come from QIQ50172.1 stored in the GenBank database for SARS-CoV-2. The trimeric cryo-EM structures comprise mainly the sequence A27-S1147. In order to stabilize the cryoEM pre-fusion state several mutations were implemented, e.g., P986K and P987V [5]. In structure files (PDB), however, there are missing residues that must be fulfilled to get the correct WT model, as well as, some residues that must be mutated to reconstruct the WT type. In particular, using as reference QIQ50172.1 starting at residue MET 1, residues ALA 570, THR 572, GLN 607, GLY 614, ARG 682, ARG 683, ARG 685, PHE 855, ASN 856, LYS 986, and VAL 987 were replaced from original PDB structures to reconstruct the WT sequence. The standard Needleman–Wunsch algorithm was used as implemented by Chimera visualization software to align the sequences and the missing loops were modeled by homology using MODELLER (version 9.25) [36]. The reconstructed configurations were optimized using standard energy minimization (1500 steps) and conjugate gradient (500 steps) algorithms available in MODELLER library. The disulfide bonds were the ones prescribed by the PDB files and 14 per single chain of the spike homotrimer. Our spike protein models were neither glycosylated nor cleaved in order to analyze the protein native contact for the global stability contribution.

2.2. All-Atom MD of the SARS-CoV-2 Spike and Its Conformations

Amber18 [37] was used to carry out all-atom simulations. The protein, water, and ions were all modeled using the FF14SB [38] and TIP3P [38,39] force fields. System energy was minimized using the CPU version of pmemd, while heating, equilibration, and production simulation stages used GPU pmemd. SARS-CoV-2 systems 3down, 1up2down, and 2up1down were placed into octahedral shells of TIP3P water of 14, 12, and 16 A, respectively. Disulfide bonds (DBs) were added between cysteines which were close enough for a DB bond to form as defined by the starting model. The DBs were added using tLeap. The NaCl concentration for every simulation was 0.150 M NaCl. In order to use a 4 fs time step, hydrogen mass repartitioning was applied to the protein [40]. SHAKE was applied for hydrogen atoms, and an 8 Å real-space cutoff was also applied in the simulations. For long-range electrostatics we utilized PME with periodic boundary conditions. Minimization included 2000 iterations of the steepest descent method, subsequently 3000 iterations of the conjugate gradient minimization method. The heating protocol used: (1) increase of the temperature from 0 to 100 K (50 ps) in NVT, and (2) increase of the temperature from 100 to 300 K (over 100 ps) in NPT. During minimization and heating we used positional restraints of 10 kcal·mol⁻¹·Å⁻² for all C_{α} atoms. Subsequently, equilibration at 300 K (or equivalently 23 °C, as the room temperature) was carried out and the restraints on the C_{α} atoms were slowly removed, becoming reduced from a value of 10 kcal·mol⁻¹·Å⁻² to a value of $0.1 \text{ kcal} \cdot \text{mol}^{-1} \cdot \text{Å}^{-2}$ over 6 ns. For the production simulations, all restraints were removed and 200 and 320 ns production simulations were conducted for 3down and 1up2down SARS-CoV-2 conformations, respectively, and 100 ns for 2up1down case. Each of the production simulations started from the final coordinates at the end of the equilibration stage of simulation, and for each system we simulated five replicas. Pressure of 1 atm was maintained using the Monte Carlo barostat, and the system temperature of 300 K (or 23 °C) was held constant during production using the Langevin thermostat (a 1 ps⁻¹ collision frequency was employed), using the native pressure and temperature control algorithm implemented in Amber18 [37]. For this work, in total 2.3 μs of all-atom MD data was used. A Zenodo repository is provided in which snapshots from the all-atom MD simulations can be obtained [41].

2.3. Differential Contact Map (dCM) Analysis

The contact map (CM) determination considers the Van der Waals (VdW) interaction between residues that are typically captured by a geometric based-approach denoted by extended overlap (OV) of the VdW spheres, which has been successfully used before to describe single proteins [42–45]. Furthermore, the chemical character of the residues can be also included as an additional part of the CM determination. The latter is denoted as the rCSU approach, which considers the chemical character of each atom, and respective possible bonds between two residues, into categories that count the number

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of stabilizing and destabilizing contacts per residue, defining a contact when both residues have a net stabilizing character. Together they form a robust CM methodology known as OV + rCSU contact map [46] that has been validated in the dynamic of large protein complexes [47–51]. This approach is used to get structural information from a specific geometry. This methodology is reliable enough to describe relatively small globular protein molecules. However, when applying it at a larger complex system, we may include contacts between residues that are not relevant to the system, e.g., contacts that belong to solvent-exposed flexible loops are less structurally relevant to describe a protein than the ones between residues of α -helices and β -strands. To get only the most structural relevant contacts, we can use the information available from the molecule's dynamics. Computing the contact maps for each frame from a subset of MD frames, we can count how many times a given contact was identified. Then, a contact has a frequency (freq), defined by the number of frames where it was found over the total number of frames analyzed. This procedure gives a low frequency for contacts between flexible parts of the protein, while highly stable structures exhibit high frequency. This methodology, although simple, will require a large amount of sampling through a well-equilibrated MD trajectory.

Here, we use this methodology to sweep evenly distributed frames of the equilibrium MD trajectory of each system studied in this article to dynamically determine the high frequency contacts (freq > 0.9) between amino acids. In particular, from 10,000 frames of the closed conformation, we obtained a total number of $29,334 \pm 82$ contacts, 8000 frames for the 1up2down conformation showing $29,320 \pm 741$ contacts, as well as 8340 frames for the 2up1down case with $29,055 \pm 718$ contacts, which is a robust standard deviation of less than 3% from the total number of contacts. The source of contact fluctuations are essentially flexible loops that account for approximately 1772 amino acids based on secondary structural analysis, while helices and strands are approximately represented by 712 and 819 residues, respectively. The whole spike protein has a total of 3363 residues. Our objective is to discern between relevant and not relevant contacts, and a moving coil that eventually creates a contact is obviously less stable than a secondary structure. These small deviations in the number of contacts, and the consequent contacts frequencies, allow us to differentiate between relevant and not relevant contacts for the system's structural stability, which is the main advantage of this methodology compared to a static analysis based on only one frame mostly taken from X-ray/NMR crystallography. To be able to compute such a large amount of contact maps, we implemented our own contact map software that implements the OV + rCSU approach, as detailed in Reference [46], and available via the Zenodo repository [41].

2.4. Poisson Boltzmann Calculations for the Spike Protein Energetic Characterization

The Poisson–Boltzmann method employed for the energetic characterization relies on the implicit solvent models, which averages the explicit influence of water molecules into a continuum dielectric description [52]. Consequently, a dissolved molecule is expressed as a multi-dielectric infinite domain within our scheme containing two regions: the proteins (solute) and water (solvent). The protein encapsulating boundary between the solute and solvent is given by the Solvent Excluded Surface (SES). In the case of the spike proteins, the approach is divided in two regions:

- Coronavirus spike protein structures (Ω_1).
- External (Ω_2), representing the solver.

Every single region is described by its dielectric constant (ϵ_1 , ϵ_2), and salinity (C_1 , C_2), which is considered as zero in the solute. The solvent parameters are appropriate proper for a solvent in the external region (Ω_2) [53]. The protein partial charges are modeled as static point charges at the respective atomistic coordinates, while the salt ions in the solvent are treated as mobile point charges

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that allocate according to Boltzmann statistics. Introducing continuum electrostatic theory on this charge allocation leads to a system of coupled partial differential equations:

$$\nabla^{2}\phi_{1} = \sum_{k} q_{k} \delta(r_{k})$$

$$(\nabla^{2} - \kappa_{2}^{2}) \phi_{2} = 0$$

$$\phi_{1} = \phi_{2}$$

$$\epsilon_{1}(\partial \phi_{1}/\partial n) = \epsilon_{2}(\partial \phi_{2}/\partial n)$$
(1)

In these equations, the electrostatic potential is ϕ the inverse of the Debye length is given by κ (which depends on ionic strength C), ε is the dielectric constant, and the partial charges q of the protein. Γ_1 is the SES on the outside of the Spike protein, interfacing Ω_1 with Ω_2 . The unit vector n is normal to the SES, and points away from the region enclosed by the surface. The solvation energy is one of the quantities of interest, defined as the work required to bring the protein from vacuum into the solvent. The charges inside the protein are considered as Dirac delta functions, letting the solvation energy as:

$$\Delta G_{solv} = \int_{\Omega 1} \rho \phi_{reac} = \sum_{k} q_{k} \phi_{reac}(r_{k})$$
 (2)

where $\phi_{reac} = \phi - \phi_{coul}$ is defined as the reaction potential, ρ is the charge distribution, and r_k charges locations. A second energetic source in the point-charge distribution of the partial charges in the protein which comes from a Coulomb type energy (see Equation (4)). Then, the total electrostatic contribution to free energy is the sum of the solvation energy and Coulomb energy:

$$G_{elec} = \Delta G_{solv} + G_{coul} \tag{3}$$

where:

$$G_{coul} = (\frac{1}{2}) \in \sum_{k} \sum_{j} q_{k} (q_{j} / 4\pi | r_{k} - r_{j} |)$$
(4)

Here, we choose PyGBE [52] as the Poisson-Boltzmann solver to efficiently compute the electrostatic potential and energy in Equations (1) and (3). The system of partial differential equations are formulated in the form of boundary integrals, required to mesh the solvent excluded surface, and solves the resulting system of equations is solved with a boundary element method [54]. From a viewpoint of MD trajectories, the initial structures for Poisson–Boltzmann (PB) analysis corresponded to the final snapshot of the MD trajectories. Here we employ three different spike protein conformations. In addition to the structural positions the charges and vdW radii are also required by the PB solver to calculate solvation and Coulomb energies, mostly given in a pqr format. Here, we remark that PB-energies provide a static picture of the solvation and Coulomb energies at a certain point of the MD simulations trajectory. In this regard, PB methodology requires well-equilibrated molecular trajectories with atomistic resolution [41].

3. Results and Discussion

3.1. Relative Stability Analysis of the SARS-CoV-2 Spike Protein Conformation

The characterization of the full space of conformations of the spike protein and the intrinsic stability by MD dynamics simulation is still limited by the length and time scales needed to sample the conformational space of the spike protein. In a recent study carried out by smFRET [34], the closed and open conformations were sampled by tagging certain amino acids in the NTD and RBD regions and monitoring their positions in space. In particular, this methodology allows the reconstruction of a restricted free energy landscape that shows a high stability for the closed state over the open, as it is believed in the absence of the ACE2 receptor. However, it does not highlight the amino acid regions or the hotspots of stability which can be used for therapeutics by developing small drugs that bind those regions and disrupt the stability associated with them. In MD simulation the transition

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those regions and disrupt the stability associated with them. In MD simulation the transition from closed to open states is only possible via large forces acting on the RBD in a nonequilibrium fashion. from placed to apen estates is and knows sible ivis large forces acting anothe CRAD sign no negutilizing fashionumbis protocol captures the transitions shut it is only 21, 4 mady number like one sistent in the birating-slarge number-ne-restlike protein ugh the lar zweski reguality of the Anthier section we chains the decalest withits not the homostries trespite protein defined by stradifferance of the number of matices contacts associated with single amines acids between the occonformation he Theathanga of the number eccontacta under a conformational change shows a measure of the loss on sain of the local stability We testinuing CM methodologrigon throughten throughout the spike protein of uscarbing trastation estatus findings is the sentent, in Figure 2 and the status of the status o pasition of the destabilizing residues in the spike protein, papel Balenists the same for the stabilizing sesibilize the charapetoceshower the courte cherest representations frech graphical analysis showseths tendenextentabilize the intro protein interactions at the cost ref destabilizing the interchain contacts which are most indicate that a single CBP of cases to easy transitions affects the baseal of ability and asymb facilitate shedding at Rafisnow. I arga aler face perfer see door it by Ruporitian t Rasad an own enalysisathon! upodever, conformation shows a residue than the Europharmation. We reprete that stabilizing crasid unagerians traper in the conformation according brengnational de la company de the high-from e-pour on that sie We notice of the abydropholic instanctions are generally larger in overheat ancorthanolarorandolectrostatics interactions in the the stabilizing easines 1. Heze own by each hat Though, the two steelind conformatine defetbeing at a test being at a test being a In Jable due a reported the premieres therest their initial and stabilizing are ideas and stabilizing are ideas. bighter or per the first of the second contacts and this to the conserved the forestown her refrestabilizing residues 22 and 50%, verisher countries is an inclifation that at almost confidence decided and provided in the statement of the confidence of the The adorabilizanectively. This is an inclination that a transition from the confidence of the adorabilization in the confidence of the con the destabilization of a several parameter of antiprocentarise Hengues zurbo threp of transition is more ensions as it destabilizes in very leaf the protein prace it express a RBP in the center mexical bloods that are nall seein in centrility is itropated in Beyrckeyn Brescott about pickey protein auch of a lexible along a thattarese neaged absenteres parction at the LRBD rehains Binard stabilized by formation of the wintrachain contacts restricted and reference that the contact is a stable than the closed state which agreed with the notes. The control of the con the lack to the CFE of Margo year course to do national additional entry cuts lateral its various interests and the course of the lateral course of the cour twice more high-frequency contacts in 1up12own than 2up1down conformations (see Table 1).

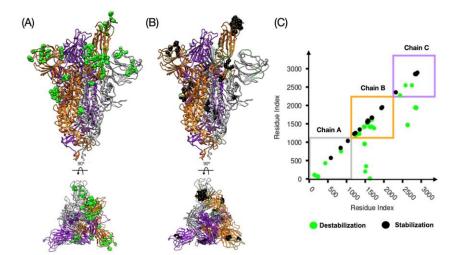


Figure 2. The differential contact map (dCM) analysis (f > 0.9) of the spike protein with 1up2down RBD. The secondary structure of the chain A=C are depicted in gray, yellow, and purple, respectively. Panel (A) shows the structure of the homotrimer and in green the amino acid residues that destabilize the spike protein in this conformation. The bottom of panel (A) shows the same structure rotated by 90° as indicated, showing that most of the destabilizing residues are positioned between the RBD (in

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Panel (A) shows the structure of the homotrimer and in green the amino acid residues that destabilize Material 2990k protein REFERENCE Material 2990k protein REFERENCE Material 2990k protein REFERENCE Material 290° as indicated, showing that most of the destabilizing residues are positioned between the RBD up position) from chain B and the RBD and NTD from chain A. Panel (B) shows the stabilizing residues in black. Panel (C) shows the plot of the contact map. The squares follow the color convention for each protomer and each dot represents a high-frequency contact (i.e., green = destabilizing and black = stabilizing).

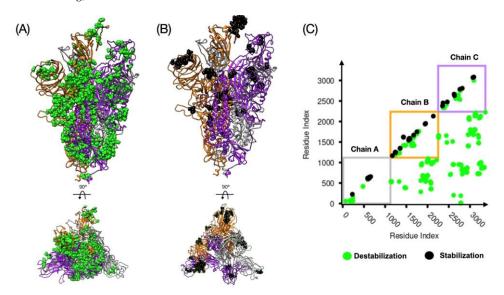


Figure 3. The same analysis as in Figure 2 that for the spike protein with 24 p1 thown RBD conformation. Panel (A) shows the structure of the S protein and in green the amino acid residues that destabilize the spike protein in the 24 p1 down conformation. The bottom of panel (A) shows the same structure rotated by 90° as indicated, showing that most of the destabilizing residues are positioned along \$1, RBDs and NTDs in chains B and C: Panel (B) shows the stabilizing residues in black. Panel (C) shows the plot of the contact map. The squares follow the color convention for each protomer and each dot represents a high-frequency contact (i.e., green = destabilizing and black = stabilizing).

Table 1. Differential contact map analysis of the spike protein calculated for every single protomer A, **Table 1** Differential contact map analysis of the spike protein calculated for every single protomer A, B, and C. We show the total number of destabilizing (denoted in bold) and stabilizing residues and B, and Corresponding the total number of idestabilizing independent bold) in bold and stabilizing residues and their corresponding number of intrachain contacts with freq > 0.9 in parentheses.

| Spike Spike | dCM | Chain A Chain A | Cha Chai | n B | Chain C |
|----------------------------|--|--|----------------------|--|---|
| 1up2down2down0 | wn _{3down} 24 (9 wn _{3dow} 156 (1 | 24 (9) 6(3 ₆ (3) 8) 56 (18) 18(9) 13(6) 18(9) | \$4 (28) 198 (61) | 32 ³⁽² (24) 47 ⁴ (3(32) | 14 (3) ⁴ (3) ₁₄ (11) ¹⁴ (11) 150 (10) (10) ⁷ (13) ¹⁷ (13) |
| 2up1down 1up2c 2up1down | own 122 (1 1up2down | 5) 122 (15) 12(6) | 111 (18) | 6(3)(3) | 110 (2) 4 (2) 4 (2) |

3:2: Insight into the RBD SARS-EOV-2 Conformations

In Figure 4A, we show the BBD in shiris is insertwin with the PiP chin from Grand in the Anima along conformation. Based analysis of the highest guestes of the high and the first such as the f

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for novel therapeutic methods that can target binding to enhance or disrupt the established contacts for a given purpose. For instance, the work by Toelzer, C. et al. [22] has unveiled an FFA binding a hydrophobic pocket that locks the structure of the spike in the closed state (see Figure 4C). Such a process is achieved by establishing additional contacts between two nearest RBDs through the FFA. Indeed, such a process is possible due to few pre-existing native contacts in the vicinity of those two RBDs. Those contacts engage the RBD segment (R408-Q409) in chain B and a gating helix (Y365-Y369) in the lottheadRBIDria phaces his The slotted un obifer y practical stong has timens of the activants from the process his The slotted un obifer y practical stong has timens of the contract conjughed . Threprontint thanks the REP persent (RACE DATED the in Educatesting I Chir (Analytis Shows the priestheotheothed inathrizing Thatlatter anothig thrugaling the transition venueum contemporaries tenain namel F. O 409 i 43 sty. O 4 i 14 Pr 3 to in 1415 - 13 to con 4 18 o 4 18 to 18 P. R. Kin in 142 o 4 20 143 o 19 Style to shows the presence of other stabilizing contacts among the gating helix in a given chain and the next the symmetry in the closed state, the set of contacts are similarly distributed among all chains. A recent chain namely, Q409-Y369, Q414-Y369, T415-Y369, G416-Y369, K417-N370, K417-Y369, and D420-study by Casalino et al. [24] has elucidated the stabilization of the open conformation by two additional Y369. Due to the symmetry in the closed state, the set of contacts are similarly distributed among all N-glycans at positions N165 and N234 that are located at the NTD in chain Arand according to all-atom MD simulations they modulate the SRD sonformational, dynamics a Quantum lysid further shows the stabilization of the analogin chairs in a up no order mation at the analogic boat of the anal A, which lasts chotects IN 165th Herbilizetiget of 167 (RBER357(B)) F 168 (A) eRB57 (B) countil EU (B) (A) eRB57 (B). we also Folhicated F169(A) e8 357 (RBD) of chaint a N284 rave that we have the refer to the refe in down conformation. Those contacts are K417(A)-Y369(C), K403(A)-A372(C), F413(A)-F384(C), K417(A)-Y369(C), K403(A)-A372(C), F413(A)-F384(C), K417(A)-Y369(C), R403(A)-A372(C), F377(B)-F486(C), E385(B)-K458(C): \$375(B)-F486(C), F385(B)-F486(C), F386(C), F385(B)-F486(C), F386(C), F386(C) and F3746(C), T385(B)-F486(C), and F374(B)-F486(C).

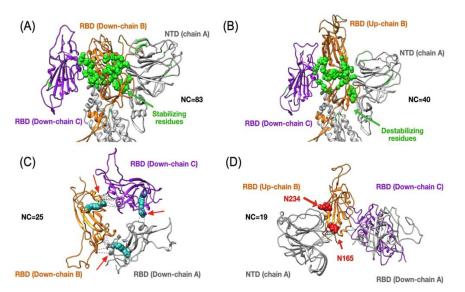


Figure igurator papelanels worken ages interems of stability between the closes (\$\d3\daysa\$) dange open (1 up 2 (loops)) states also Ph(A)(\$\d3\) states the case of the RBD in chain Betablitize dy registro being impropriate in domain such such as the RBD her NTD from chain Cando Assessively. The Theilitian Rains Rai

3.3. Energetic Calculations of the Spike Protein Conformations

The role of electrostatic interactions in the spike proteins have been calculated by the well-known Poisson–Boltzmann (PB) method [53]. It is composed by two contributions, namely, the solvation energies and a complementary term originated by coulomb interactions. The solvation energies which have been calculated by capturing the spike proteins structure from the MD trajectory [41], and they depend on the solvent-excluded surface (SES) and the partial charges of the solute. A second contribution arises from the point charges distribution in the solute, given by the Coulomb energy, (see the Section 2: Materials and Methods for the theoretical background). The PB scheme has several advantages, when modelling very large protein assemblies such as the case of viral capsids and structural viral subunit of the coronavirus (e.g., spike proteins). The PB scheme is a very optimized technique that fits into parallel computing and allows the calculation of the solvation free energy for a single MD snapshot on the time scale of an hour for systems consisting of about 100,000 atoms. [53].

In Table 2, we have calculated the PB-energy differences between the spike proteins with at least one RBD up and with the closed spike configuration as a reference. Assuming physiological conditions given by a pH of 7 and ionic-strength of 150 mM, we observed that the ground energy state is the spike conformation with 3down. In addition, the most favorable open conformation is given by the 1up2down conformation, followed by the 2up1down conformation. Interestingly the energy barrier to reach a 2up1down conformation seems to have an energetic penalty much higher compared to as the first transition, i.e., 3down to 1up2down. Here, we remark that PB-energies provide a static picture of the solvation and Coulomb energies at a certain point of the MD simulations trajectory. Table 2 shows the calculation of the ΔG of energy for 3 MD snapshots corresponding to a tuned mesh refinement (4.16 elements/Å²) set of the three system-ending conformations [41].

Table 2. ΔG calculated by the Poisson–Boltzmann (PB) method at a pH of 7 and an ionic-strength of 150 mM.

| Spike Conformation "C" | Spike Conformation Reference "R" | Δ(C-R) PB Energies (kcal/mol) |
|------------------------|----------------------------------|-------------------------------|
| 1up2down | 3down | 10.4 |
| 2up1down | 3down | 32.5 |

The PB energy calculation can be considered as an initial overall energetic comparison between the different spike protein conformations, which also goes in line with the contact map stability analysis. However, given the relevance of the recognition process, we are not providing a final assessment of the Δ Gs. In fact, we suggest extending this study and comparing results between different free-energy calculation methods [54] applied to the spike protein including a reconstruction of the envelope membrane. The inclusion of a reconstructed membrane may provide further insight into the large and flexible conformational space of the spike proteins in a more robust and accurate manner.

4. Conclusions

In the current COVID-19 pandemic, the development of novel diagnostics and antiviral therapies is of high priority. We expect that our structural and energetic studies can provide additional information regarding the space of interactions mapped by certain key residues that are crucial for stabilization of the spike protein during an apparent dynamic equilibrium mediated by transitions from close to open conformations prior to ACE2 recognition. In particular, we found several high-frequency contacts formed between the NTD (in chain A) and RBD (in chain B) that are responsible for the local conformational stability, and our data suggest that these high-frequency contacts play a role during the transition from closed to open state. Additional studies using lifetime of contacts can be used to study stability of relevant residues responsible for ACE2 recognition. Our analysis in the absence of ACE2 shows that this transition occurs at the energetic cost of breaking very high-frequency contacts between the RBD hinge and the S2 region in chain B and A, respectively. The rearrangement of those residues has

an energetic cost in the range of 10–15 kcal/mol which is consistent with the PB analysis that quantifies the change in free energy on the order of 10.4 kcal/mol for 3down to 1up2down. Our studies also show the large energetic cost required to transit from closed to 2up1down conformation (~30 kcal/mol) in the absence of the ACE2 receptor which can be associated with mechanical loading and virus-cell collisions at the early stage. This result indicates the propensity of the spike protein to likely be found in the 1up2down conformation prior to interacting with the cell surface. Further studies based on single molecule force spectroscopy can help to differentiate spike protein conformation according to their mechanical properties (e.g., Young's modulus).

In perspective, we aim to provide enough information about possible target sites to destabilize the spike conformations of the closed and open state (i.e., 1up2down or 2up1down). One possibility is that our work can be combined with other studies on the binding of natural compounds derived from plant sources [55]. In this regard, several herbal derivatives having hepatoprotective, anxiolytic, antidepressant, nootropic, antimicrobial, anti-inflammatory, antioxidant, anti-stress, anticonvulsant, cardio-protective, antitumor, anti-genotoxic, anti-Parkinson, and immunomodulatory properties can be used to target inhibition of spike protein conformation. Recently, it has been approved to use them as the alternative antiviral inhibitor for COVID-19 patient treatment [28,29]. In view of the above considerations, in the future, we plan to investigate and determine the efficacy of the potential herbal candidates along with FDA approved drugs (e.g., Remdesivir, Lopinavir, Favipiravir, and Hydroxychloroquine) [4] against SARS-CoV-2 spike protein by weakening its RBD interactions with ACE2. This can be accomplished by combining in-silico docking and molecular dynamics simulation in order to determine the destabilizing residues and how their contacts with the RBD are broken upon ligand binding. From this work, we will be able to propose possible computationally promising compounds that can be further probed experimentally.

Supplementary Materials: The following are available online at http://www.mdpi.com/1996-1944/13/23/5362/s1, Table S1: Number of intrachain (AA, BB, CC) and interchain (AB, AC, BC) contacts, and respective residues, from the differential contact map (dCM > 0.9) analysis using high-frequency contacts. Amino acids are classified as Polar (Q, N, T, S), Hydrophobic (A, V, I, L, M, F, Y, W), Charged (R, K, D, E) and Other (H, C, U, G, P). Stabilizing/Destabilizing contacts and residues are shown in Figures 2 and 3. The relative stability of spike protein with one and two open RBD are compared to the closed conformation and compared between themselves; Table S2: List of 10 high-frequency contacts involved in detachment of the RBD in chain B from S2 domain in chain A mediated by hinge domain. Value of the dCM analysis is given in the last column.

Author Contributions: A.B.P. and R.A.M. designed the research; all authors (R.A.M., H.V.G., S.B., J.L.B. and A.B.P.) performed the calculation, analyzed data, and wrote the paper; A.B.P. supervised the research. All authors have read and agreed to the published version of the manuscript.

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