

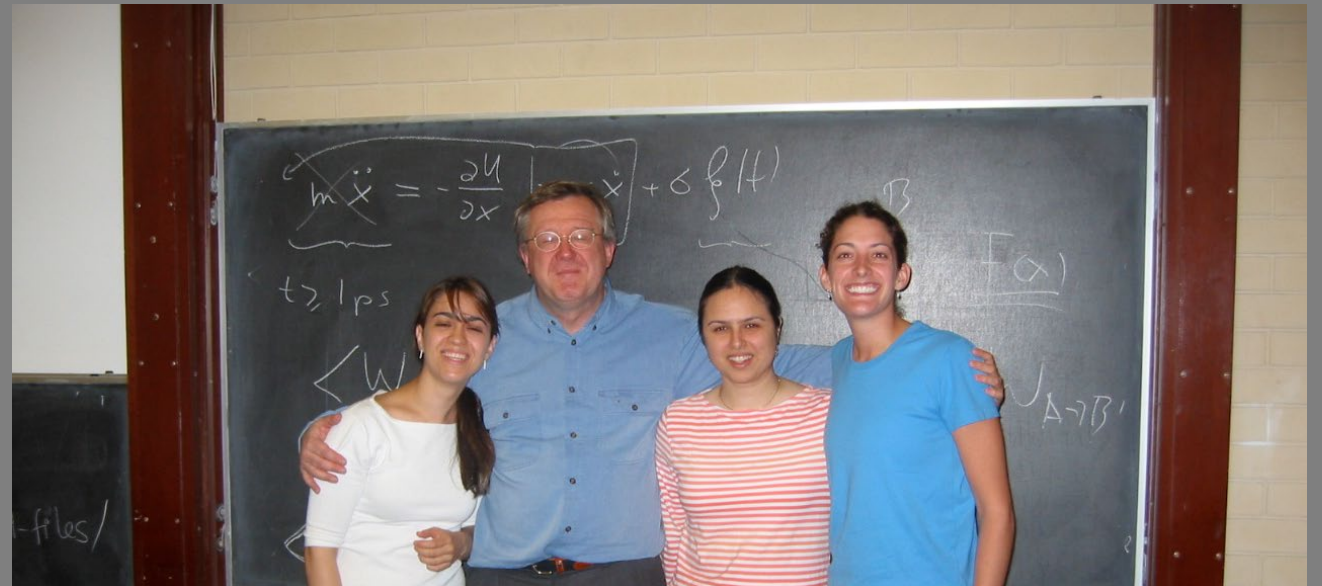
# Computational Microscopy of SARS-CoV-2

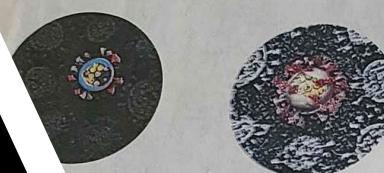
Rommie Amaro . UC San Diego . March 2021



'... my goal was to look with mathematical and computational means at the inside of cells, one atom at a time, to decipher how living systems work. That is what I strived for and I never deflected from this goal.'

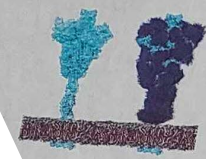
Klaus Schulten





A cryo-electron micrograph image of a coronavirus.

A computer reconstruction overlaid on an image of several SARS-CoV-2 viruses.



A spike protein, at left, and a protective coating of sugars, at right.

# The Coronavirus Unveiled

By Carl Zimmer Oct. 9, 2020

## The Coronavirus Is Unveiled Down to Its Blobs and Pores

By CARL ZIMMER

IN FEBRUARY, AS the new coronavirus swept across China and shut down entire cities, a scientist named Sai Li set out to paint its portrait.

At the time, the best pictures anyone had managed to take were low-resolution images, in which the virus looked like a barely discernible smudge.

Dr. Li, a structural biologist at Tsinghua University in Beijing, joined forces with virologists who were raising the virus in a laboratory in the city of Hangzhou. Those researchers dosed the viruses with chemicals to render them harmless and then sent them to Dr. Li.

Dr. Li and his colleagues then concentrated the virus-laden fluid from a quart down to a single drop. He could only hope that the weeks of work to produce that drop would not have been a waste.

"At the time, you don't know what's inside," Dr. Li said. "It's just liquid, right?"

Dr. Li carefully froze the drop in a fraction of a second.

He then used a cryo-electron microscope to take pictures of the frozen proteins. The pictures reminded Dr. Li of eggs in a nest.

Thanks to the work of scientists like Dr. Li, the new coronavirus, known as SARS-CoV-2, is no longer a cipher. They have come to know it in intimate, atomic detail. They've discovered how it uses some of its mately twisted genes to commandeer our cellular factories, while others build nurseries for making new viruses. And some researchers are using supercomputers to create complete, virtual viruses that they hope to use to understand how the real viruses have spread with such devastating ease. (Figure 2)

"This time is unlike anything any of us has experienced, just in terms of the bombardment of data," said Rommie

Amaro, a computational biologist at the University of California, San Diego.

Earlier this year, Dr. Amaro and other researchers directed their attention to the protein's surface. Spike proteins have an essential job to play: They latch onto cells in our airway so the virus can slip inside. But it soon became clear that the name is a misnomer. The spike protein is not sharp, narrow

Each spike protein snaps together with two others, forming a structure that has a tulip-like shape. A long stem anchors the proteins to the virus, and their top looks like a three-part flower.

Gerhard Hummer, a computational physicist at the Max Planck Institute of Biophysics, and his colleagues used the frozen proteins embedded in the virus membrane. (Figure 3) Then they calculated how the atoms in the proteins pushed and pulled on each other. The result was a molecular dance. The spike proteins swivel around on

He could see thousands of coronaviruses packed in the ice like jellybeans in a jar. They were beautifully intact, allowing him to inspect details on the viruses that measured less than a millionth of an inch.

"I thought, I was the first

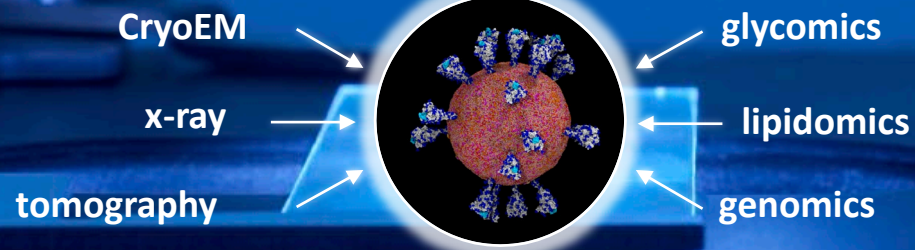
"You

# Molecular Dynamics Simulations as a Computational Microscope



$$U(\vec{R}) = \sum_{bonds} k_i^{bond} (r_i - r_0)^2 + \sum_{angles} k_i^{angle} (\theta_i - \theta_0)^2 + \sum_{dihed} k_i^{dihed} [1 + \cos(n_i \phi_i + \delta_i)] + \sum_i \sum_{j \neq i} 4 \epsilon_{ij} \left[ \left( \frac{\sigma_{ij}}{r_{ij}} \right)^{12} - \left( \frac{\sigma_{ij}}{r_{ij}} \right)^6 \right] + \sum_i \sum_{j \neq i} \frac{q_i q_j}{\epsilon r_{ij}}$$

$$\vec{F}_i = ma = m_i \frac{d^2 \vec{r}_i}{dt^2} = -\vec{\nabla} U(\vec{R})$$



Data centric computational simulations integrate and extend experimental data

# Mesoscale All-Atom Influenza Virus Simulations Suggest New Substrate Binding Mechanism

Jacob D. Durrant, Sarah E. Kochanek, Lorenzo Casalino, Pek U. Ieong, Abigail C. Dommer, and Rommie E. Amaro\*

✓ **Cite this:** *ACS Cent. Sci.* 2020, 6, 2, 189–196

Publication Date: February 19, 2020 ▾

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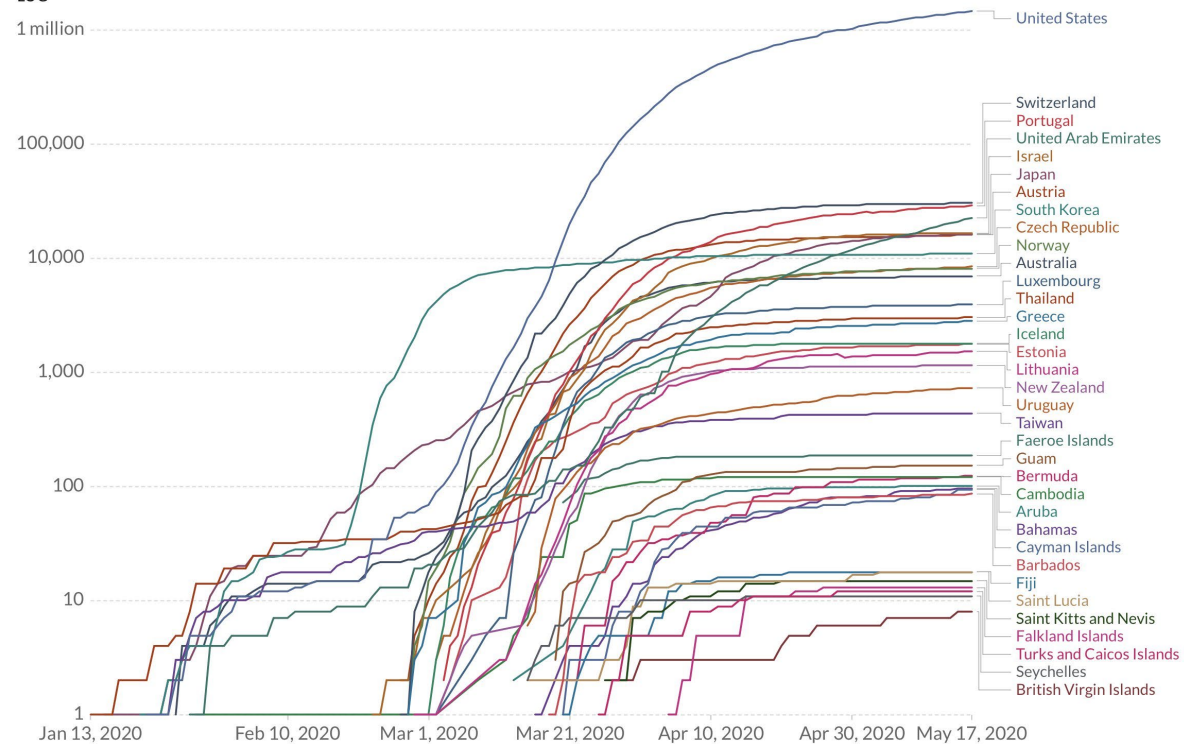
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## Total confirmed COVID-19 cases

The number of confirmed cases is lower than the number of total cases. The main reason for this is limited testing.

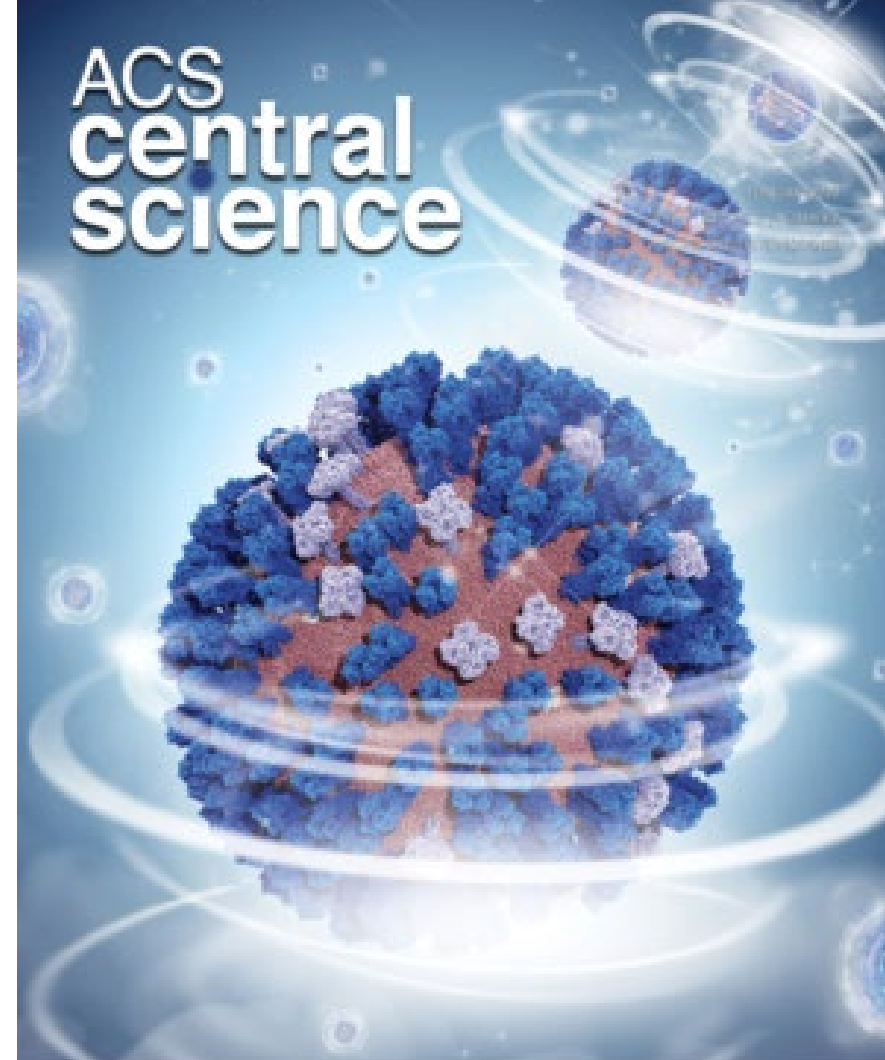
LOG



Source: European CDC - Situation Update Worldwide - Data last updated 17th May, 02:15 (GMT-07:00)

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▶ Jan 13, 2020  May 17, 2020



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This was the day we pivoted our efforts towards SARS-CoV-2

bioRxiv is receiving many new papers on coronavirus SARS-CoV-2. A reminder: these are preliminary reports that have not been peer-reviewed. They should not be regarded as conclusive, guide clinical practice/health-related behavior, or be reported in news media as established information.

New Results

## Cryo-EM Structure of the 2019-nCoV Spike in the Prefusion Conformation

Daniel Wrapp, Nianshuang Wang, Kizzmekia S. Corbett, Jory A. Goldsmith, Ching-Lin Hsieh, Olubukola Abiona, Barney S. Graham, Jason S. McLellan

doi: <https://doi.org/10.1101/2020.02.11.944462>

Now published in *Science* doi: [10.1126/science.abb2507](https://doi.org/10.1126/science.abb2507)

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Posted February 15, 2020.

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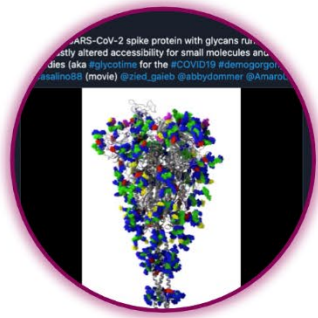
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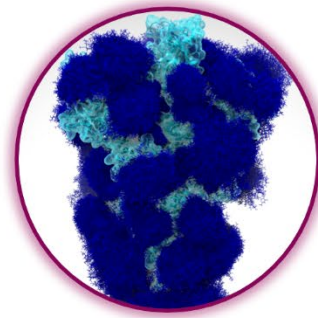
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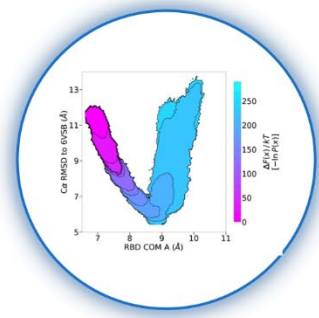
Preprint servers such as bioRxiv have been critical to research in this space



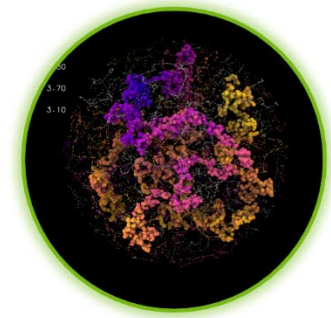
First Tweet



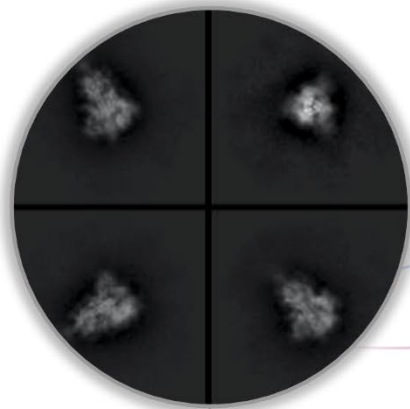
First spike BiorXiv



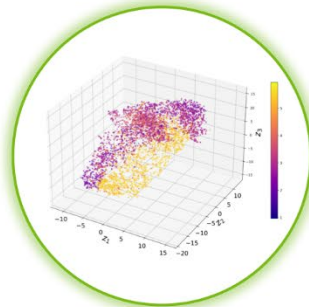
Ensemble Pathways



AAE Inference Finds Outliers and New States



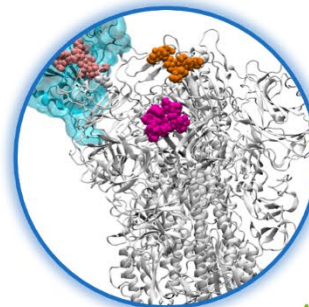
First CryoEM Images



First Test of CVAE Model

HPC Consortium Award

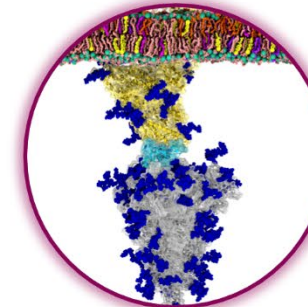
First Model Parallel CVAE Runs



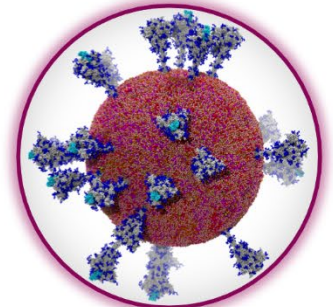
Early WE Runs

Adversarial AE Developed

AAE Trained w/ WE Data



8.5 M Atom Simulation



305 M Atom Simulation

AI Enabled Key Feature Extraction

Large Model MD Simulation

Weighted Ensemble Pathways

2020

February

March

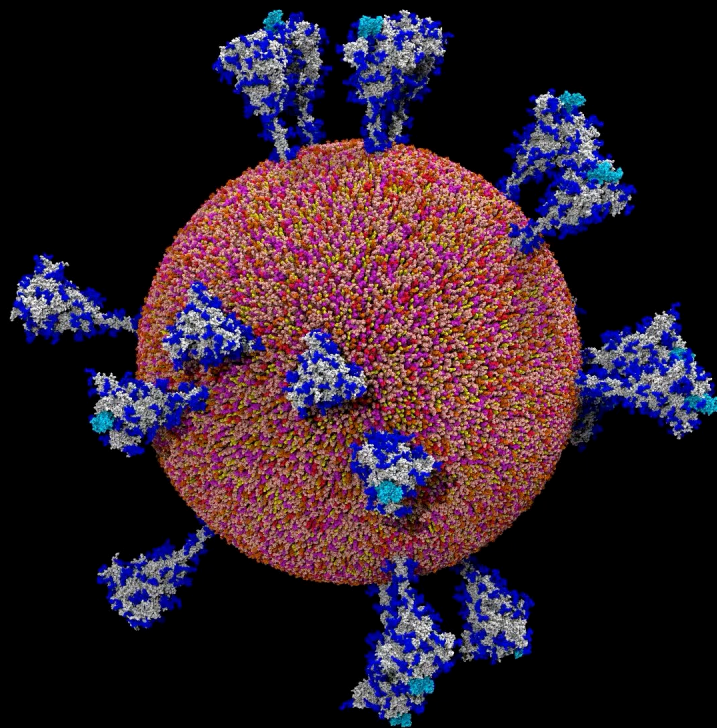
April

June

August

October



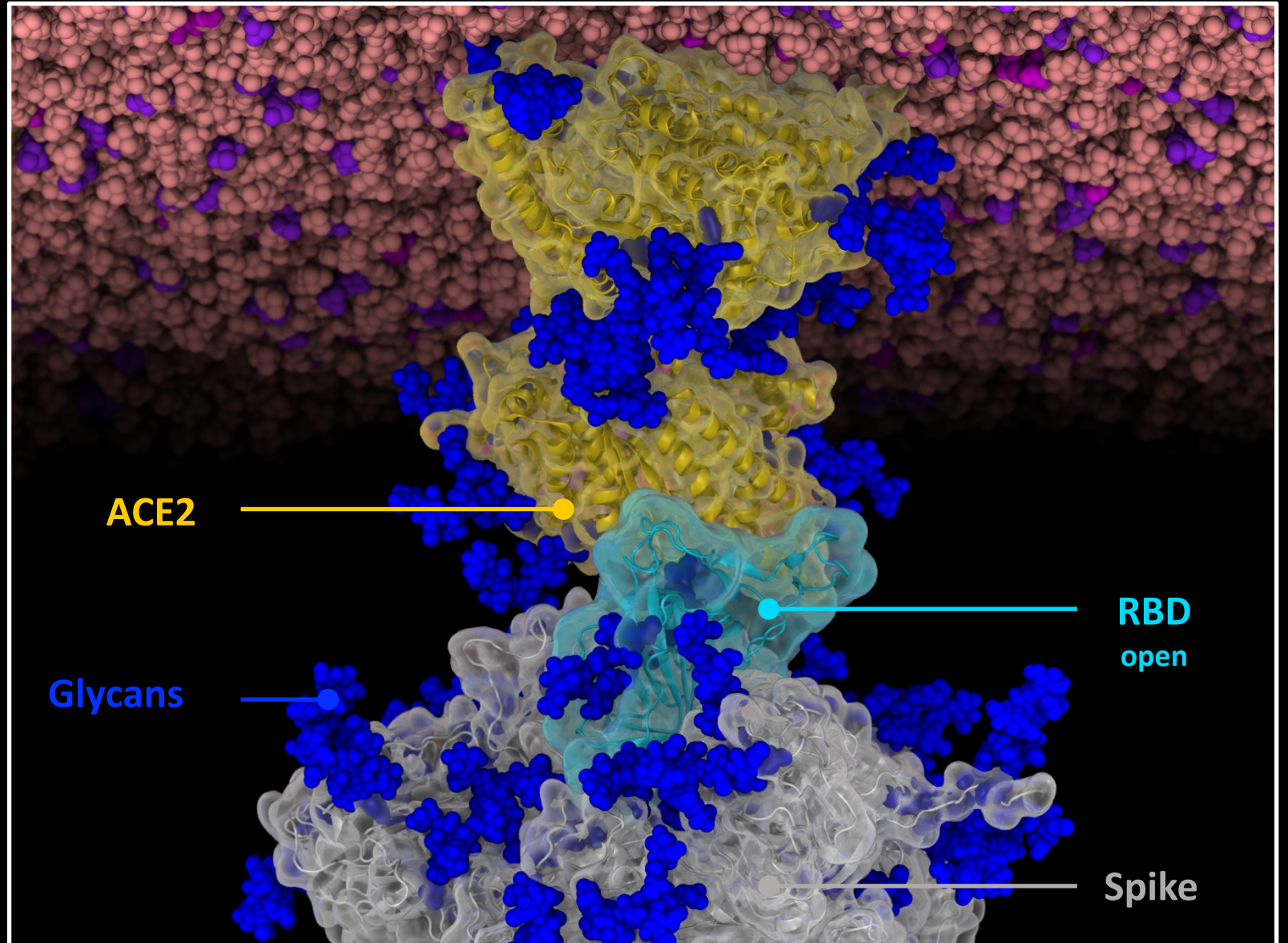
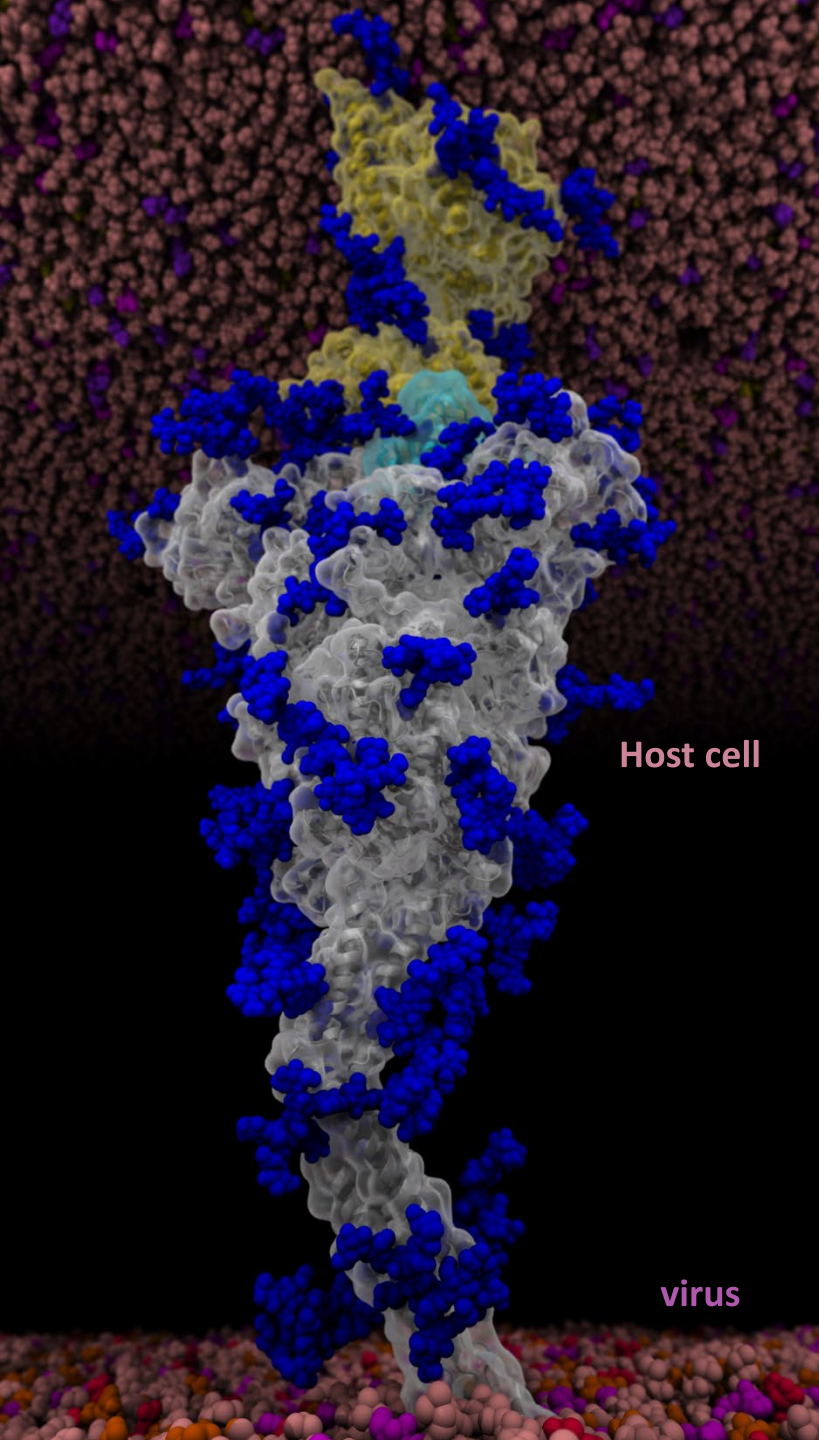


**SARS-CoV-2 virus**

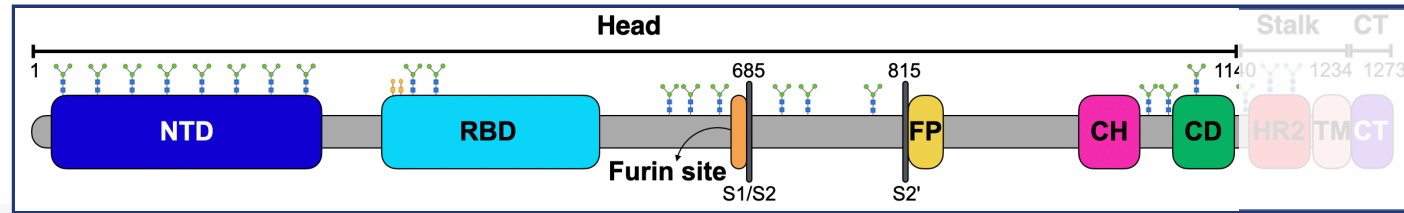


# SARS-CoV-2 infection route

The spike protein latches onto ACE2 to infect the host cell



# Modeling of the spike's head



## REPORT

### Cryo-EM structure of the 2019-nCoV spike in the prefusion conformation

Daniel Wrapp<sup>1,\*</sup>, Nianshuang Wang<sup>1,\*</sup>, Kizzmekia S. Corbett<sup>2</sup>, Jory A. Goldsmith<sup>1</sup>, Ching-Lin Hsieh<sup>1</sup>, Olubukola Abiona<sup>2</sup>, Barney S. Graham<sup>2</sup>, Jason S. McLellan<sup>1,†</sup>

<sup>1</sup>Department of Molecular Biosciences, The University of Texas at Austin, Austin, TX 78712, USA.

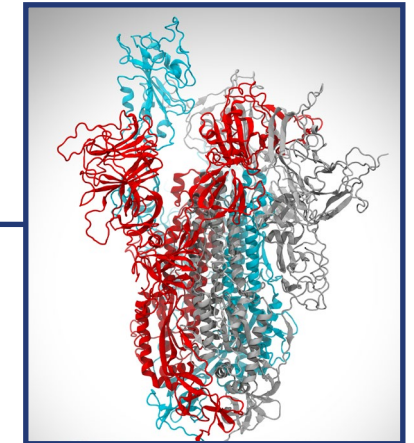
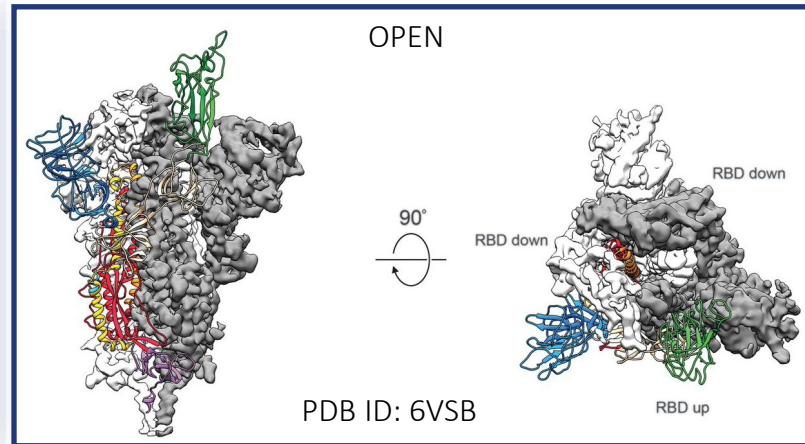
<sup>2</sup>Vaccine Research Center, National Institute of Allergy and Infectious Diseases, National Institutes of Health, Bethesda, MD 20892, USA.

†Corresponding author. Email: [jmclellan@austin.utexas.edu](mailto:jmclellan@austin.utexas.edu)

\* These authors contributed equally to this work.

- Hide authors and affiliations

Science 13 Mar 2020:  
Vol. 367, Issue 6483, pp. 1260-1263  
DOI: 10.1126/science.abb2507



## Article

Cell

### Structure, Function, and Antigenicity of the SARS-CoV-2 Spike Glycoprotein

Alexandra C. Walls<sup>1,5</sup>, Young-Jun Park<sup>1,5</sup>, M. Alejandra Tortorici<sup>1,2</sup>, Abigail Wall<sup>3</sup>, Andrew T. McGuire<sup>3,4</sup>, and David Veasley<sup>1,6,\*</sup>

<sup>1</sup>Department of Biochemistry, University of Washington, Seattle, WA 98195, USA

<sup>2</sup>Institute Pasteur & CNRS UMR 3569, Unité de Virologie Structurale, Paris 75015, France

<sup>3</sup>Vaccines and Infectious Diseases Division, Fred Hutchinson Cancer Research Center, Seattle, WA 98195, USA

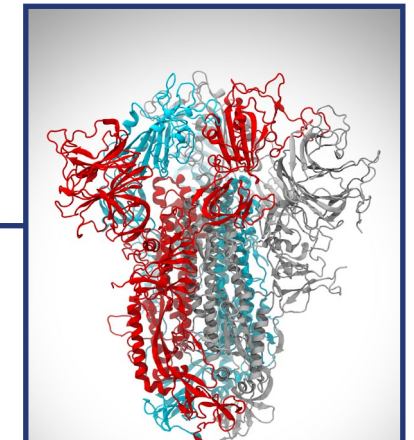
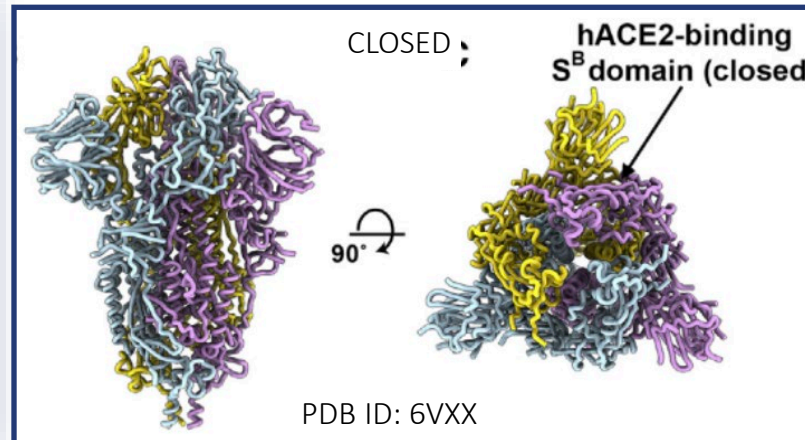
<sup>4</sup>Department of Global Health, University of Washington, Seattle, WA 98195, USA

<sup>5</sup>These authors contributed equally

<sup>6</sup>Lead Contact

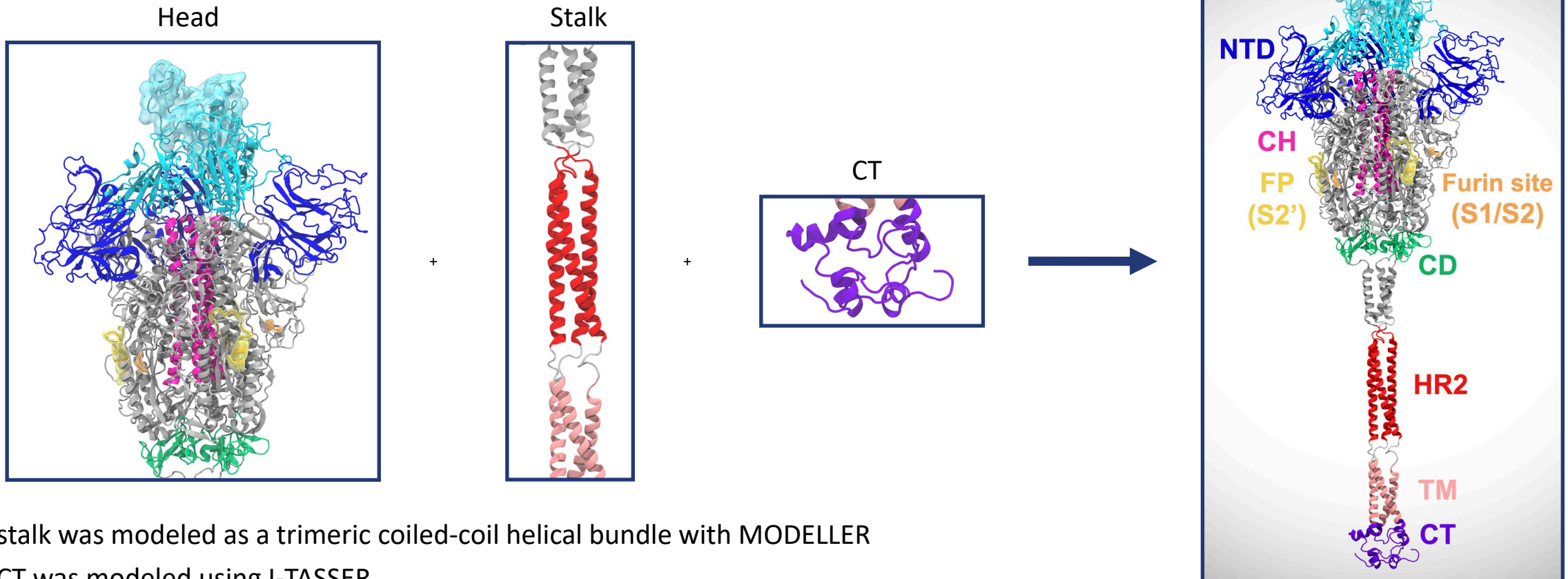
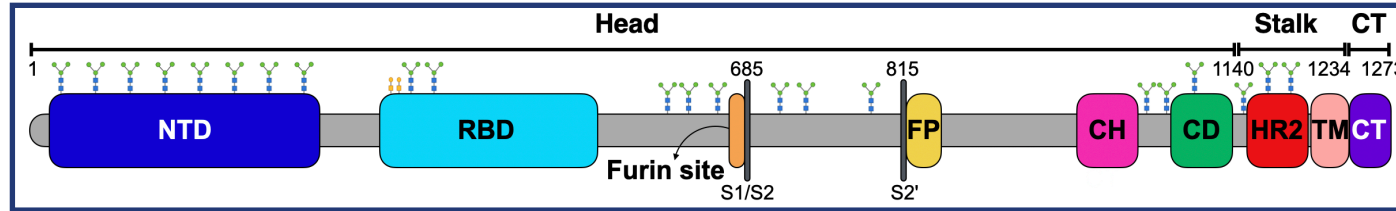
\*Correspondence: [dveesler@uw.edu](mailto:dveesler@uw.edu)

<https://doi.org/10.1016/j.cell.2020.02.058>



Gaps in the Cryo-EM structures corresponding to flexible loop were modeled using MODELLER

# Modeling the spike's stalk and CT



The stalk was modeled as a trimeric coiled-coil helical bundle with MODELLER

The CT was modeled using I-TASSER

# N- and O-linked Glycans

Science

REPORTS

Cite as: Y. Watanabe *et al.*, *Science* 10.1126/science.abb9983 (2020).

## Site-specific glycan analysis of the SARS-CoV-2 spike

Yasunori Watanabe<sup>1,2,3\*</sup>, Joel D. Allen<sup>1\*</sup>, Daniel Wrapp<sup>4</sup>, Jason S. McLellan<sup>4</sup>, Max Crispin<sup>1†</sup>

<sup>1</sup>School of Biological Sciences, University of Southampton, Southampton SO17 1BJ, UK. <sup>2</sup>Oxford Glycobiology Institute, Department of Biochemistry, University of Oxford, South Parks Road, Oxford OX1 3QU, UK. <sup>3</sup>Division of Structural Biology, University of Oxford, Wellcome Centre for Human Genetics, Oxford OX3 7BN, UK. <sup>4</sup>Department of Molecular Biosciences, The University of Texas at Austin, Austin, TX 78712, USA.

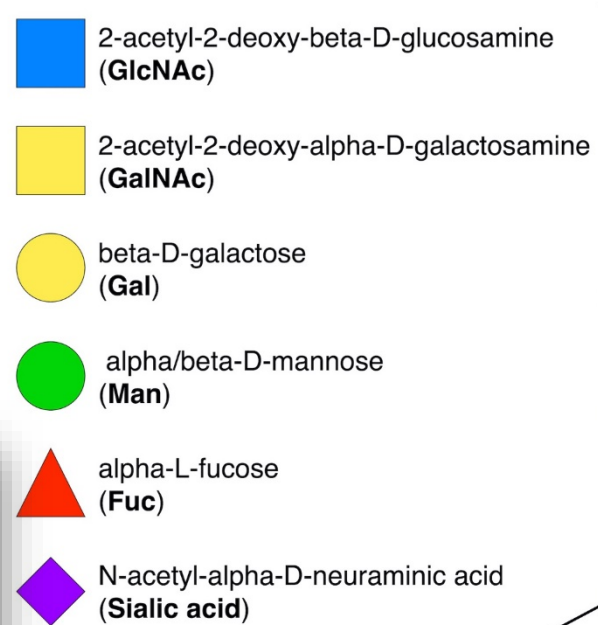
\*These authors contributed equally to this work. †Corresponding author. Email: max.crispin@soton.ac.uk

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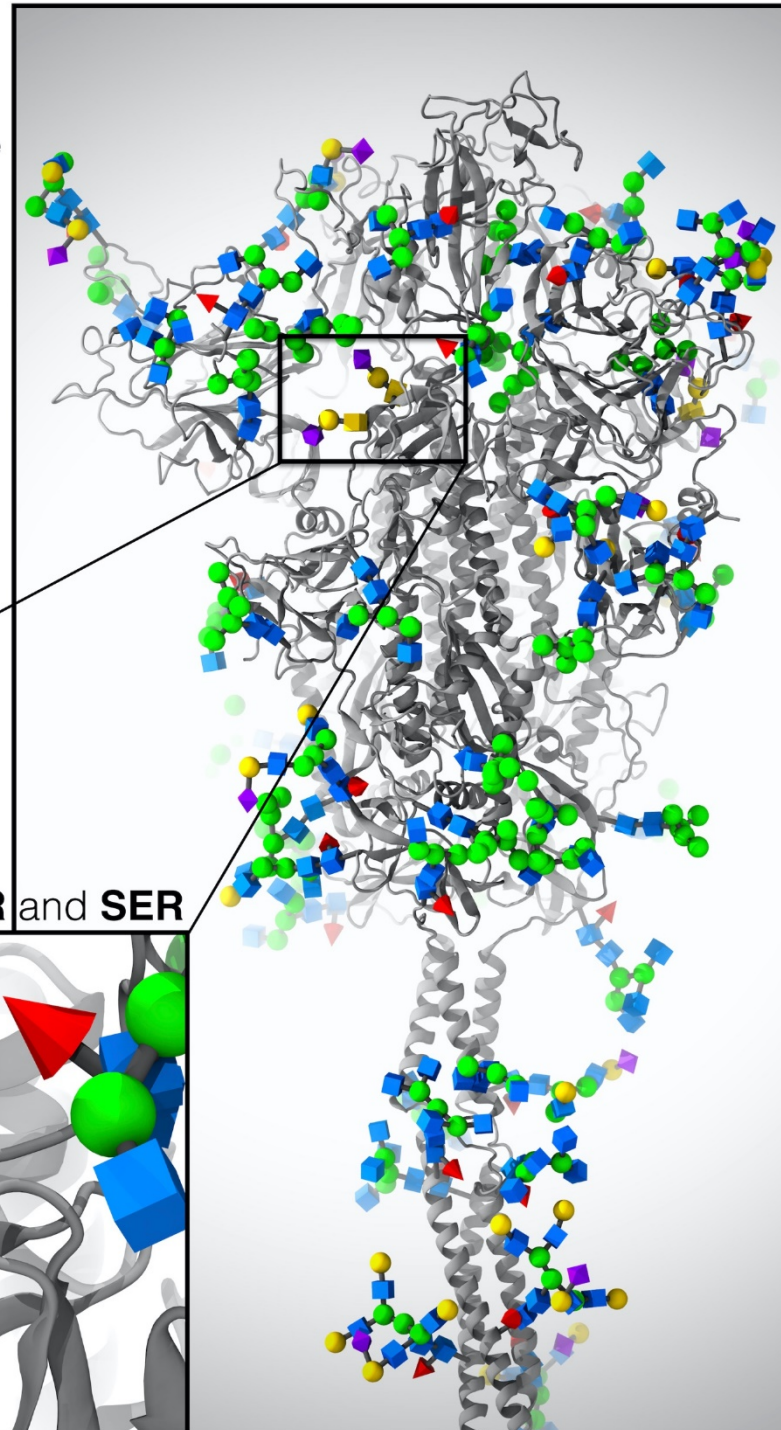
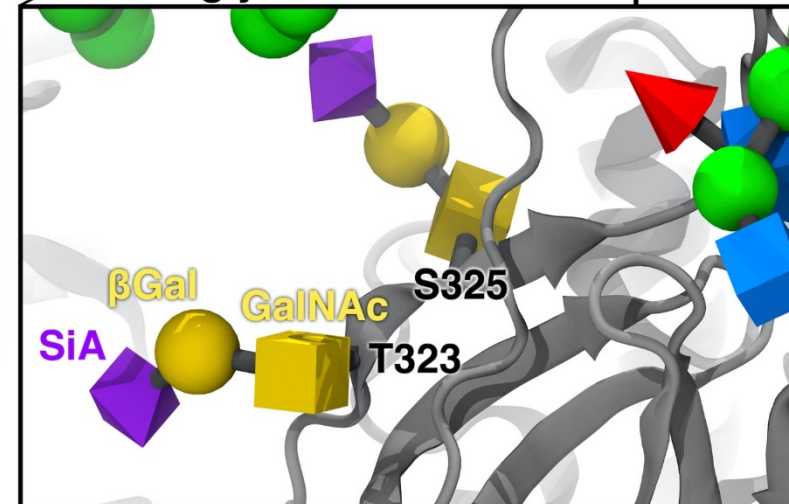
## Deducing the N- and O- glycosylation profile of the spike protein of novel coronavirus SARS-CoV-2

Asif Shajahan, Nitin T. Supekar, Anne S. Gleinich, and Parastoo Azadi\*

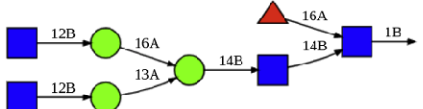
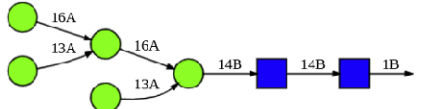
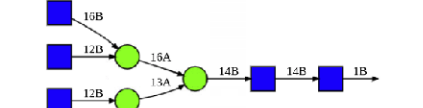
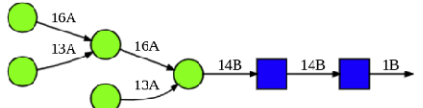
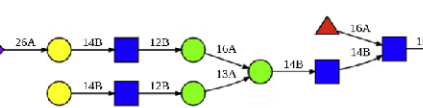
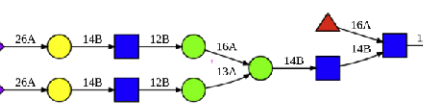

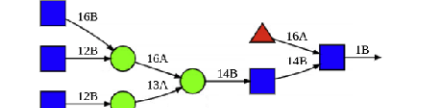
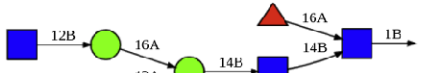
Complex Carbohydrate Research Center, The University of Georgia, Athens, GA 30602



O-glycans: linked to THR and SER



# CHAIN A

#	SARS-CoV-2 sequon	TYPE	STRUCTURE	SEQUENCE
G1	N17	FA2		bDGlcNAc(1→2)aDMan(1→6)[bDGlcNAc(1→2)aDMan(1→3)]bDMan(1→4)bDGlcNAc(1→4) [aLFuc(1→6)]bDGlcNAc(1→)PROA-17
G2	N61	M5		aDMan(1→6)[aDMan(1→3)]aDMan(1→6) [aDMan(1→3)]bDMan(1→4)bDGlcNAc(1→4)bDGlcNAc(1→)PROA-61
G3	N74	A3		bDGlcNAc(1→6)[bDGlcNAc(1→2)]aDMan(1→6) [bDGlcNAc(1→2)aDMan(1→3)]bDMan(1→4)bDGlcNAc(1→4)bDGlcNAc(1→)PROA-74
G4	N122	M5		aDMan(1→6)[aDMan(1→3)]aDMan(1→6) [aDMan(1→3)]bDMan(1→4)bDGlcNAc(1→4)bDGlcNAc(1→)PROA-122
G5	N149	FA2G2S1		aDNeu5Ac(2→6)bDGal(1→4)bDGlcNAc(1→2)aDMan(1→6) [bDGal(1→4)bDGlcNAc(1→2)aDMan(1→3)]bDMan(1→4)bDGlcNAc(1→4) [aLFuc(1→6)]bDGlcNAc(1→)PROA-149
G6	N165	FA2G2S2		xADNeu5Ac(2→6)bDGal(1→4)bDGlcNAc(1→2)aDMan(1→6) [aDNeu5Ac(2→6)bDGal(1→4)bDGlcNAc(1→2)aDMan(1→3)]bDMan(1→4)bDGlcNAc(1→4) [aLFuc(1→6)]bDGlcNAc(1→)PROA-165
G7	N234	M8		aDMan(1→2)aDMan(1→6)[aDMan(1→3)]aDMan(1→6) [aDMan(1→2)aDMan(1→2)aDMan(1→3)]bDMan(1→4)bDGlcNAc(1→4)bDGlcNAc(1→)PROA-234
G8	N282	FA3		bDGlcNAc(1→6)[bDGlcNAc(1→2)]aDMan(1→6) [bDGlcNAc(1→2)aDMan(1→3)]bDMan(1→4)bDGlcNAc(1→4)[aLFuc(1→6)]bDGlcNAc(1→)PROA-282
G9	N331	FA2		bDGlcNAc(1→2)aDMan(1→6)[bDGlcNAc(1→2)aDMan(1→3)]bDMan(1→4)bDGlcNAc(1→4) [aLFuc(1→6)]bDGlcNAc(1→)PROA-331

### CHAIN A

#	SARS-CoV-2 sequon	TYPE	STRUCTURE	SEQUENCE
G1	N17	FA2		bDGlNAc1-2)aDMan1-6)(bDGlNAc1-2)aDMan1-3)(bDMan1-4)6DGlNAc1-4)(aFuc1-6)(bDGlNAc1-1)PROA-17
G2	N61	M5		aDMan1-6)(aDMan1-3)aDMan1-6)(aDMan1-3)(bDMan1-4)bDGlNAc1-4)(bDGlNAc1-1)PROA-61
G3	N74	A3		bDGlNAc1-4)(bDGlNAc1-2)aDMan1-6)(bDGlNAc1-2)aDMan1-3)(bDMan1-4)bDGlNAc1-4)(bDGlNAc1-1)PROA-74
G4	N122	M5		aDMan1-6)(aDMan1-3)aDMan1-6)(aDMan1-3)(bDMan1-4)bDGlNAc1-4)(bDGlNAc1-1)PROA-122
G5	N149	FA2G2S1		aDNeu5Ac2-6)(bDGal1-4)bDGlNAc1-2)aDMan1-6)(bDGal1-4)(bDGlNAc1-2)aDMan1-3)(bDMan1-4)(bDGlNAc1-4)(aFuc1-6)(bDGlNAc1-1)PROA-149
G6	N165	FA2G2S2		xaDNeu5Ac2-6)(bDGal1-4)bDGlNAc1-2)aDMan1-6)(aDNeu5Ac2-6)(bDGal1-4)(bDGlNAc1-2)aDMan1-3)(bDMan1-4)(bDGlNAc1-4)(aFuc1-6)(bDGlNAc1-1)PROA-165
G7	N234	M9		aDMan1-2)aDMan1-6)(aDMan1-3)aDMan1-6)(aDMan1-2)aDMan1-3)(bDMan1-4)bDGlNAc1-4)(bDGlNAc1-1)PROA-234
G8	N282	FA3		bDGlNAc1-6)(bDGlNAc1-2)aDMan1-6)(bDGlNAc1-2)aDMan1-3)(bDMan1-4)(bDGlNAc1-4)(aFuc1-6)(bDGlNAc1-1)PROA-282
G9	N331	FA2		bDGlNAc1-2)aDMan1-6)(bDGlNAc1-2)aDMan1-3)(bDMan1-4)bDGlNAc1-4)(aFuc1-6)(bDGlNAc1-1)PROA-331
G10	N343	FA2		bDGlNAc1-2)aDMan1-6)(bDGlNAc1-2)aDMan1-3)(bDMan1-4)bDGlNAc1-4)(aFuc1-6)(bDGlNAc1-1)PROA-343
G11	N603	FA2		bDGlNAc1-2)aDMan1-6)(bDGlNAc1-2)aDMan1-3)(bDMan1-4)bDGlNAc1-4)(aFuc1-6)(bDGlNAc1-1)PROA-603
G12	N616	A2		bDGlNAc1-2)aDMan1-6)(bDGlNAc1-2)aDMan1-3)(bDMan1-4)bDGlNAc1-4)(aFuc1-6)(bDGlNAc1-1)PROA-616
G13	N657	M5		aDMan1-6)(aDMan1-3)aDMan1-6)(aDMan1-3)(bDMan1-4)bDGlNAc1-4)(bDGlNAc1-1)PROA-657
G14	N709	M6		aDMan1-6)(aDMan1-3)aDMan1-6)(aDMan1-3)(bDMan1-4)bDGlNAc1-4)(bDGlNAc1-1)PROA-709
G15	N717	Hybrid G1		bDGal1-4)(bDGlNAc1-2)aDMan1-3)(aDMan1-6)(aDMan1-3)(bDMan1-4)bDGlNAc1-4)(bDGlNAc1-1)PROA-717
G16	N801	M6		aDMan1-6)(aDMan1-3)aDMan1-6)(aDMan1-3)(bDMan1-4)bDGlNAc1-4)(bDGlNAc1-1)PROA-801
G17	N1074	FA2G2S1		aDNeu5Ac2-6)(bDGal1-4)bDGlNAc1-2)aDMan1-6)(bDGal1-4)(bDGlNAc1-2)aDMan1-3)(bDMan1-4)(bDGlNAc1-4)(aFuc1-6)(bDGlNAc1-1)PROA-1074
G18	N1098	FA2		bDGlNAc1-2)aDMan1-6)(bDGlNAc1-2)aDMan1-3)(bDMan1-4)bDGlNAc1-4)(aFuc1-6)(bDGlNAc1-1)PROA-1098
G19	N1134	FA1		bDGlNAc1-2)aDMan1-3)(aDMan1-6)(bDMan1-4)bDGlNAc1-4)(aFuc1-6)(bDGlNAc1-1)PROA-1134
G20	N1158	A2		bDGlNAc1-2)aDMan1-6)(bDGlNAc1-2)aDMan1-3)(bDMan1-4)bDGlNAc1-4)(aFuc1-6)(bDGlNAc1-1)PROA-1158
G21	N1173	FA4		bDGlNAc1-6)(bDGlNAc1-2)aDMan1-6)(bDGlNAc1-2)aDMan1-3)(bDMan1-4)(bDGlNAc1-4)(aFuc1-6)(bDGlNAc1-1)PROA-1173
G22	N1194	FA4G4S1		aDNeu5Ac2-6)(bDGal1-4)(bDGlNAc1-2)aDMan1-6)(bDGal1-4)(bDGlNAc1-2)aDMan1-3)(bDMan1-4)(bDGlNAc1-4)(aFuc1-6)(bDGlNAc1-1)PROA-1194
G23	T323	O-glycan		aDNeu5Ac2-3)(bDGal1-3)aDGalNAc1-1)PROA-323
G24	S325	O-glycan		aDNeu5Ac2-3)(bDGal1-3)aDGalNAc1-1)PROA-325

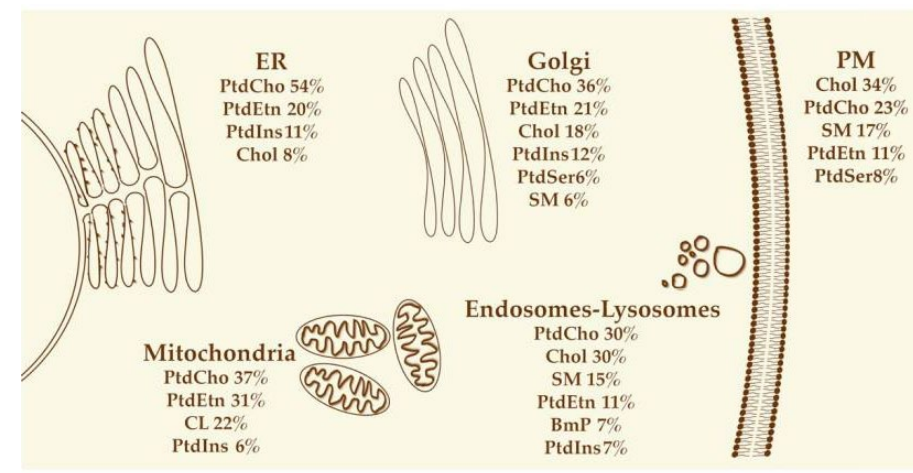
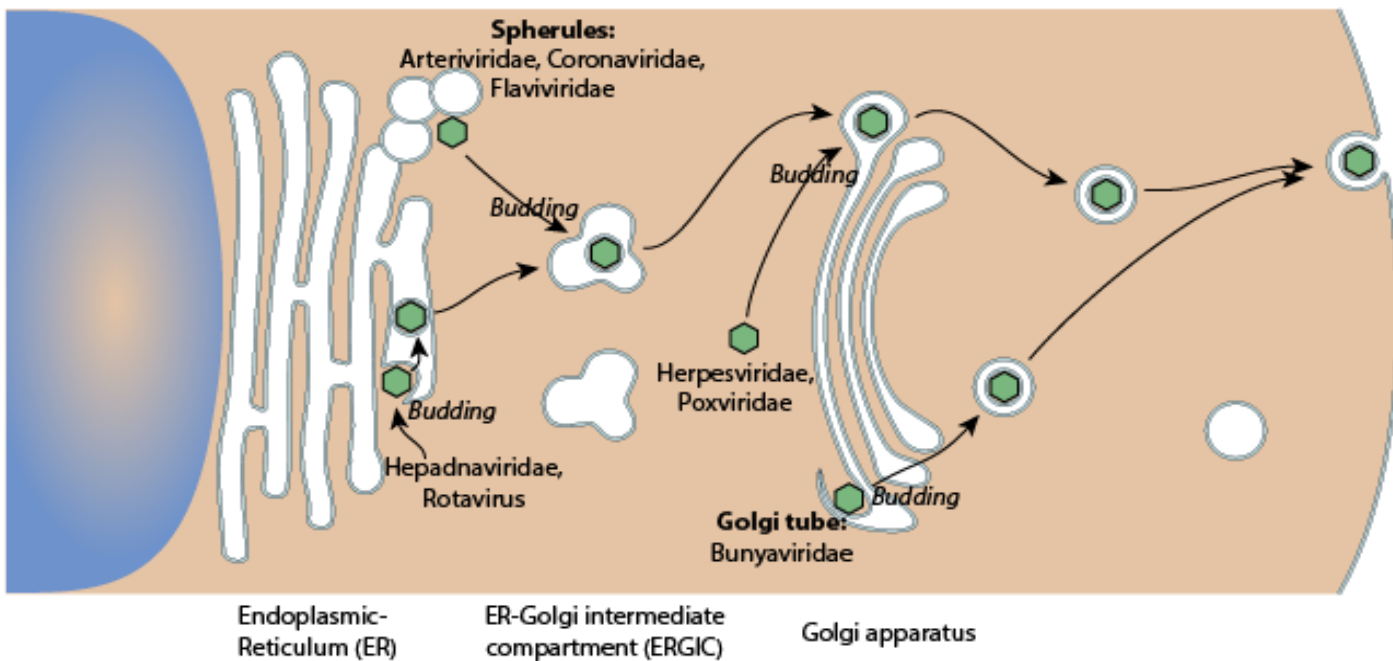
### CHAIN B

#	SARS-CoV-2 sequon	TYPE	STRUCTURE	SEQUENCE
G25	N17	FA3		bDGlNAc1-6)(bDGlNAc1-2)aDMan1-6)(bDGlNAc1-2)aDMan1-3)(bDMan1-4)(bDGlNAc1-4)(aFuc1-6)(bDGlNAc1-1)PROB-17
G26	N61	M5		aDMan1-6)(aDMan1-3)aDMan1-6)(aDMan1-3)(bDMan1-4)bDGlNAc1-4)(bDGlNAc1-1)PROB-61
G27	N74	FA3G3S2		aDNeu5Ac2-6)(bDGal1-4)(bDGlNAc1-2)aDMan1-6)(bDGal1-4)(bDGlNAc1-2)aDMan1-3)(bDMan1-4)(bDGlNAc1-4)(aFuc1-6)(bDGlNAc1-1)PROB-74
G28	N122	FA2		bDGlNAc1-2)aDMan1-6)(bDGlNAc1-2)aDMan1-3)(bDMan1-4)bDGlNAc1-4)(aFuc1-6)(bDGlNAc1-1)PROB-122
G29	N149	FA3		bDGlNAc1-6)(bDGlNAc1-2)aDMan1-6)(bDGlNAc1-2)aDMan1-3)(bDMan1-4)(bDGlNAc1-4)(aFuc1-6)(bDGlNAc1-1)PROB-149
G30	N165	M5		aDMan1-6)(aDMan1-3)aDMan1-6)(aDMan1-3)(bDMan1-4)bDGlNAc1-4)(bDGlNAc1-1)PROB-165
G31	N234	M9		aDMan1-2)aDMan1-6)(aDMan1-2)aDMan1-3)(aDMan1-6)(aDMan1-2)aDMan1-3)(bDMan1-4)bDGlNAc1-4)(bDGlNAc1-1)PROB-234
G32	N282	FA3G3S1		aDNeu5Ac2-6)(bDGal1-4)(bDGlNAc1-2)aDMan1-6)(bDGal1-4)(bDGlNAc1-2)aDMan1-3)(bDMan1-4)(bDGlNAc1-4)(aFuc1-6)(bDGlNAc1-1)PROB-282
G33	N331	FA2		bDGlNAc1-2)aDMan1-6)(bDGlNAc1-2)aDMan1-3)(bDMan1-4)bDGlNAc1-4)(aFuc1-6)(bDGlNAc1-1)PROB-331
G34	N343	FA1		bDGlNAc1-2)aDMan1-3)(aDMan1-6)(bDMan1-4)bDGlNAc1-4)(aFuc1-6)(bDGlNAc1-1)PROB-343
G35	N603	M5		aDMan1-6)(aDMan1-3)aDMan1-6)(aDMan1-3)(bDMan1-4)bDGlNAc1-4)(bDGlNAc1-1)PROB-603
G36	N616	FA2		bDGlNAc1-2)aDMan1-6)(bDGlNAc1-2)aDMan1-3)(bDMan1-4)bDGlNAc1-4)(aFuc1-6)(bDGlNAc1-1)PROB-616
G37	N657	Hybrid G1		bDGal1-4)(bDGlNAc1-2)aDMan1-6)(bDGal1-4)(bDGlNAc1-2)aDMan1-3)(bDMan1-4)(bDGlNAc1-4)(aFuc1-6)(bDGlNAc1-1)PROB-657
G38	N709	M5		aDMan1-6)(aDMan1-3)aDMan1-6)(aDMan1-3)(bDMan1-4)bDGlNAc1-4)(bDGlNAc1-1)PROB-709
G39	N717	M5		aDMan1-6)(aDMan1-3)aDMan1-6)(aDMan1-3)(bDMan1-4)bDGlNAc1-4)(bDGlNAc1-1)PROB-717
G40	N801	M7		aDMan1-2)aDMan1-6)(aDMan1-3)(aDMan1-6)(aDMan1-2)aDMan1-3)(bDMan1-4)bDGlNAc1-4)(bDGlNAc1-1)PROB-801
G41	N1074	M5		aDMan1-6)(aDMan1-3)aDMan1-6)(aDMan1-3)(bDMan1-4)bDGlNAc1-4)(bDGlNAc1-1)PROB-1074
G42	N1098	A2		bDGlNAc1-2)aDMan1-6)(bDGlNAc1-2)aDMan1-3)(bDMan1-4)bDGlNAc1-4)(aFuc1-6)(bDGlNAc1-1)PROB-1098
G43	N1134	FA3		bDGlNAc1-6)(bDGlNAc1-2)aDMan1-6)(bDGlNAc1-2)aDMan1-3)(bDMan1-4)(bDGlNAc1-4)(aFuc1-6)(bDGlNAc1-1)PROB-1134
G44	N1158	FA2G2S1		aDNeu5Ac2-6)(bDGal1-4)(bDGlNAc1-2)aDMan1-6)(bDGal1-4)(bDGlNAc1-2)aDMan1-3)(bDMan1-4)(bDGlNAc1-4)(aFuc1-6)(bDGlNAc1-1)PROB-1158
G45	N1173	FA4		bDGlNAc1-6)(bDGlNAc1-2)aDMan1-6)(bDGlNAc1-2)aDMan1-3)(bDMan1-4)(bDGlNAc1-4)(aFuc1-6)(bDGlNAc1-1)PROB-1173
G46	N1194	FA4G4S1		aDNeu5Ac2-6)(bDGal1-4)(bDGlNAc1-2)aDMan1-6)(bDGal1-4)(bDGlNAc1-2)aDMan1-3)(bDMan1-4)(bDGlNAc1-4)(aFuc1-6)(bDGlNAc1-1)PROB-1194
G47	T323	O-glycan		aDNeu5Ac2-3)(bDGal1-3)(aDNeu5Ac2-6)(bDGalNAc1-1)PROB-323

### CHAIN C

#	SARS-CoV-2 sequon	TYPE	STRUCTURE	SEQUENCE
G48	N17	FA3		bDGlNAc1-6)(bDGlNAc1-2)aDMan1-6)(bDGlNAc1-2)aDMan1-3)(bDMan1-4)(bDGlNAc1-4)(aFuc1-6)(bDGlNAc1-1)PROC-17
G49	N61	M5		aDMan1-6)(aDMan1-3)aDMan1-6)(aDMan1-3)(bDMan1-4)bDGlNAc1-4)(bDGlNAc1-1)PROC-61
G50	N74	A2		bDGlNAc1-2)aDMan1-6)(bDGlNAc1-2)aDMan1-3)(bDMan1-4)bDGlNAc1-4)(bDGlNAc1-1)PROC-74
G51	N122	M5		aDMan1-6)(aDMan1-3)aDMan1-6)(aDMan1-3)(bDMan1-4)bDGlNAc1-4)(bDGlNAc1-1)PROC-122
G52	N149	FA2		bDGlNAc1-2)aDMan1-6)(bDGlNAc1-2)aDMan1-3)(bDMan1-4)(bDGlNAc1-4)(aFuc1-6)(bDGlNAc1-1)PROC-149
G53	N165	FA2G2S1		aDNeu5Ac2-6)(bDGal1-4)(bDGlNAc1-2)aDMan1-6)(bDGal1-4)(bDGlNAc1-2)aDMan1-3)(bDMan1-4)(bDGlNAc1-4)(aFuc1-6)(bDGlNAc1-1)PROC-165
G54	N234	M9		aDMan1-2)aDMan1-6)(aDMan1-2)aDMan1-3)(aDMan1-6)(aDMan1-2)aDMan1-3)(bDMan1-4)bDGlNAc1-4)(bDGlNAc1-1)PROC-234
G55	N282	A2		bDGlNAc1-2)aDMan1-6)(bDGlNAc1-2)aDMan1-3)(bDMan1-4)(bDGlNAc1-4)(aFuc1-6)(bDGlNAc1-1)PROC-282
G56	N331	FA3G3S1		aDNeu5Ac2-6)(bDGal1-4)(bDGlNAc1-2)aDMan1-6)(bDGal1-4)(bDGlNAc1-2)aDMan1-3)(bDMan1-4)(bDGlNAc1-4)(aFuc1-6)(bDGlNAc1-1)PROC-331
G57	N343	FA2		bDGlNAc1-2)aDMan1-6)(bDGlNAc1-2)aDMan1-3)(bDMan1-4)(bDGlNAc1-4)(aFuc1-6)(bDGlNAc1-1)PROC-343
G58	N603	M5		aDMan1-6)(aDMan1-3)aDMan1-6)(aDMan1-3)(bDMan1-4)bDGlNAc1-4)(bDGlNAc1-1)PROC-603
G59	N616	FA2		bDGlNAc1-2)aDMan1-6)(bDGlNAc1-2)aDMan1-3)(bDMan1-4)(bDGlNAc1-4)(aFuc1-6)(bDGlNAc1-1)PROC-616
G60	N657	Hybrid G1		bDGal1-4)(bDGlNAc1-2)aDMan1-6)(bDGal1-4)(bDGlNAc1-2)aDMan1-3)(bDMan1-4)(bDGlNAc1-4)(aFuc1-6)(bDGlNAc1-1)PROC-657
G61	N709	M5		aDMan1-6)(aDMan1-3)aDMan1-6)(aDMan1-3)(bDMan1-4)bDGlNAc1-4)(bDGlNAc1-1)PROC-709
G62	N717	M6		aDMan1-6)(aDMan1-3)aDMan1-6)(aDMan1-3)(bDMan1-4)bDGlNAc1-4)(bDGlNAc1-1)PROC-717
G63	N801	M5		aDMan1-6)(aDMan1-3)aDMan1-6)(aDMan1-3)(bDMan1-4)bDGlNAc1-4)(bDGlNAc1-1)PROC-801
G64	N1074	M5		aDMan1-6)(aDMan1-3)aDMan1-6)(aDMan1-3)(bDMan1-4)bDGlNAc1-4)(bDGlNAc1-1)PROC-1074
G65	N1098	Hybrid G1S1		aDNeu5Ac2-6)(bDGal1-4)(bDGlNAc1-2)aDMan1-6)(bDGal1-4)(bDGlNAc1-2)aDMan1-3)(bDMan1-4)(bDGlNAc1-4)(aFuc1-6)(bDGlNAc1-1)PROC-1098
G66	N1134	FA2		bDGlNAc1-2)aDMan1-6)(bDGlNAc1-2)aDMan1-3)(bDMan1-4)(bDGlNAc1-4)(aFuc1-6)(bDGlNAc1-1)PROC-1134
G67	N1158	A2		bDGlNAc1-2)aDMan1-6)(bDGlNAc1-2)aDMan1-3)(bDMan1-4)(bDGlNAc1-4)(aFuc1-6)(bDGlNAc1-1)PROC-1158
G68	N1173	FA4		bDGlNAc1-6)(bDGlNAc1-2)aDMan1-6)(bDGlNAc1-2)aDMan1-3)(bDMan1-4)(bDGlNAc1-4)(aFuc1-6)(bDGlNAc1-1)PROC-1173
G69	N1194	FA4G4S1		aDNeu5Ac2-6)(bDGal1-4)(bDGlNAc1-2)aDMan1-6)(bDGal1-4)(bDGlNAc1-2)aDMan1-3)(bDMan1-4)(bDGlNAc1-4)(aFuc1-6)(bDGlNAc1-1)PROC-1194
G70	T323	O-glycan		bDGal1-3)(aDGalNAc1-1)PROC-323

# Now, how about that membrane?



POPC	47%
POPE	20%
CHL	15%
POPI	11%
POPS	7%

[Int J Mol Sci](#). 2019 May; 20(9): 2167.

Published online 2019 May 1. doi: [10.3390/ijms20092167](https://doi.org/10.3390/ijms20092167)

PMCID: PMC6540057

PMID: [31052427](https://pubmed.ncbi.nlm.nih.gov/31052427/)

## Membrane Lipid Composition: Effect on Membrane and Organelle Structure, Function and Compartmentalization and Therapeutic Avenues

[Doralicia Casares](#),<sup>1,2</sup> [Pablo V. Escribá](#),<sup>1,2</sup> and [Catalina Ana Rosselló](#)<sup>1,2,\*</sup>

POPC (16:0-18:1): 1-palmitoyl-2-oleoyl-sn-glycero-3-phosphocholine

CHL: cholesterol

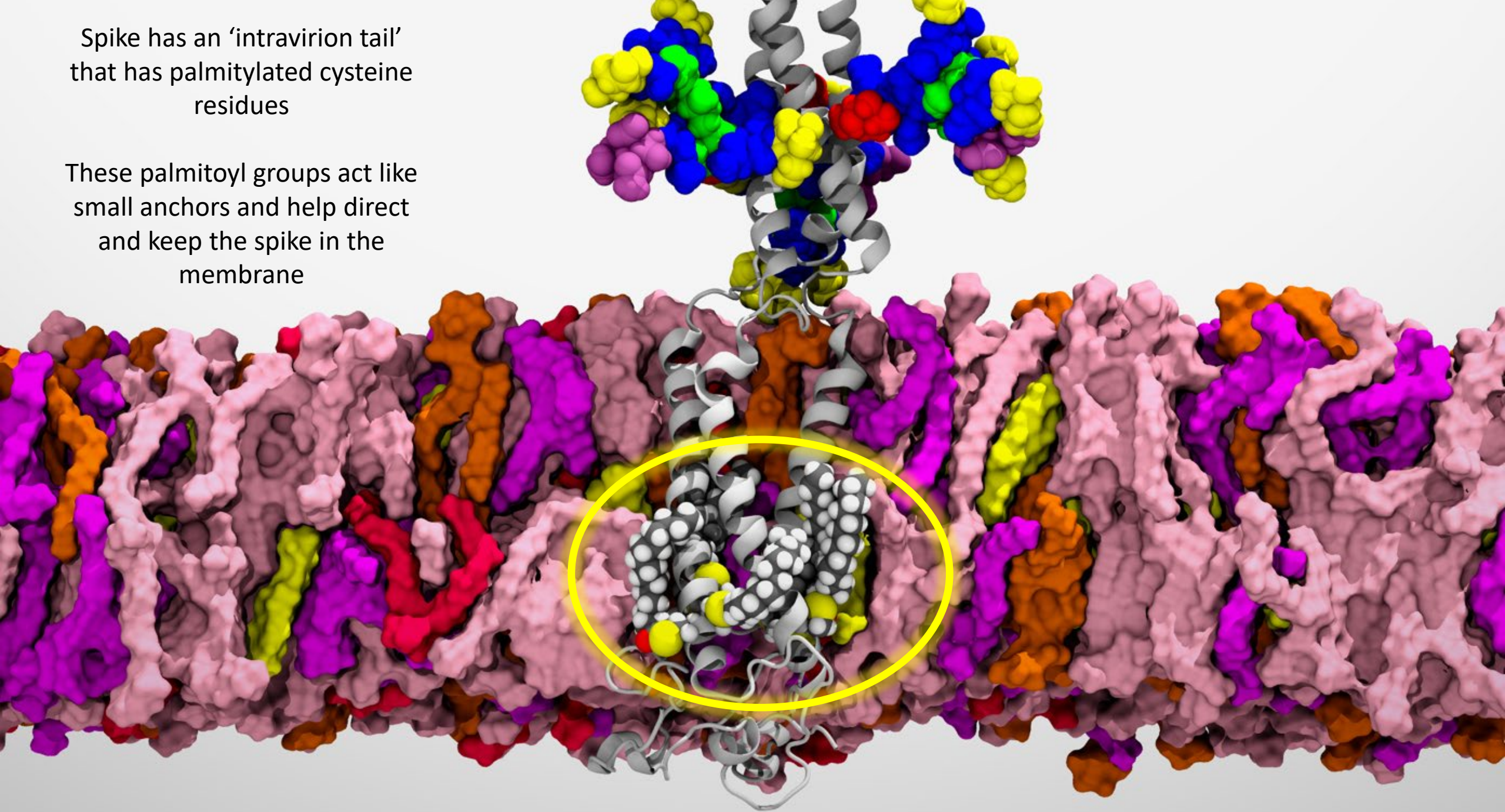
POPI (16:0-18:1): 1-palmitoyl-2-oleoyl-sn-glycero-3-phosphoinositol

POPE (16:0-18:1): 1-palmitoyl-2-oleoyl-sn-glycero-3-phosphoethanolamine

POPS (16:0-18:1): 1-palmitoyl-2-oleoyl-sn-glycero-3-phospho-L-serine

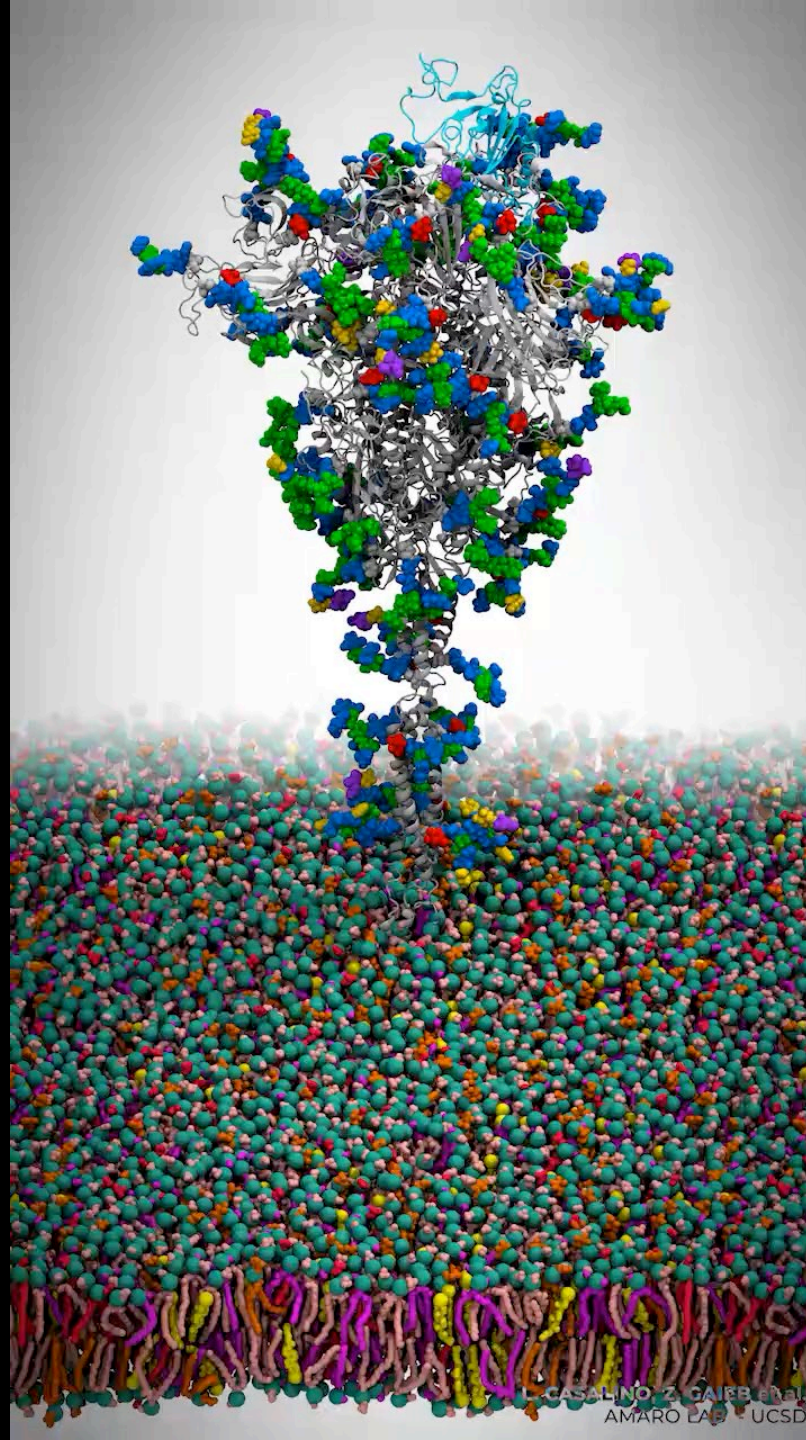
Spike has an 'intravirion tail'  
that has palmitylated cysteine  
residues

These palmitoyl groups act like  
small anchors and help direct  
and keep the spike in the  
membrane









RBD-up (Open)

RBDs-down (Closed)

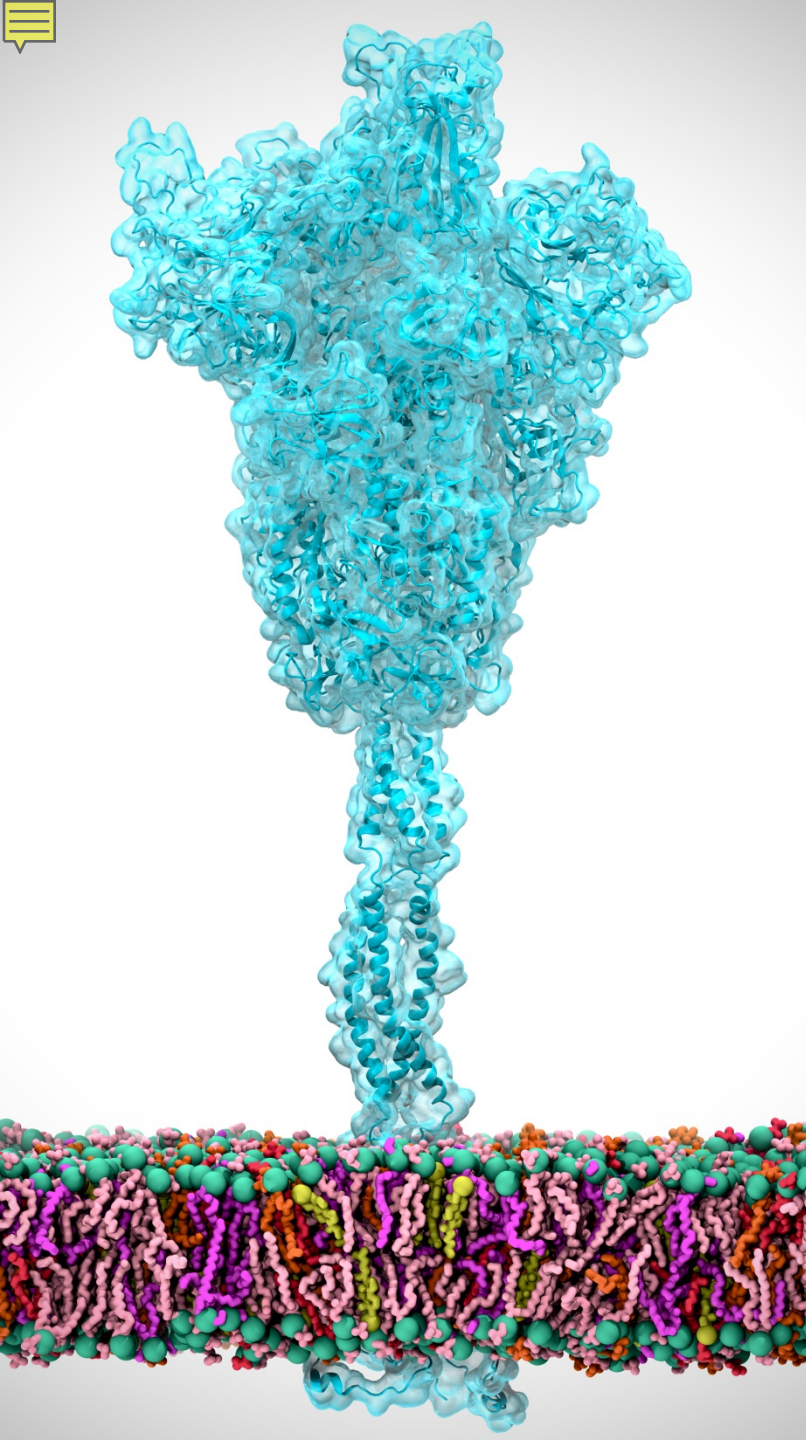
~1.7 million atoms

Charmm36 force field

NAMD2 on TACC Frontera

~ 60 ns/day on 256 nodes

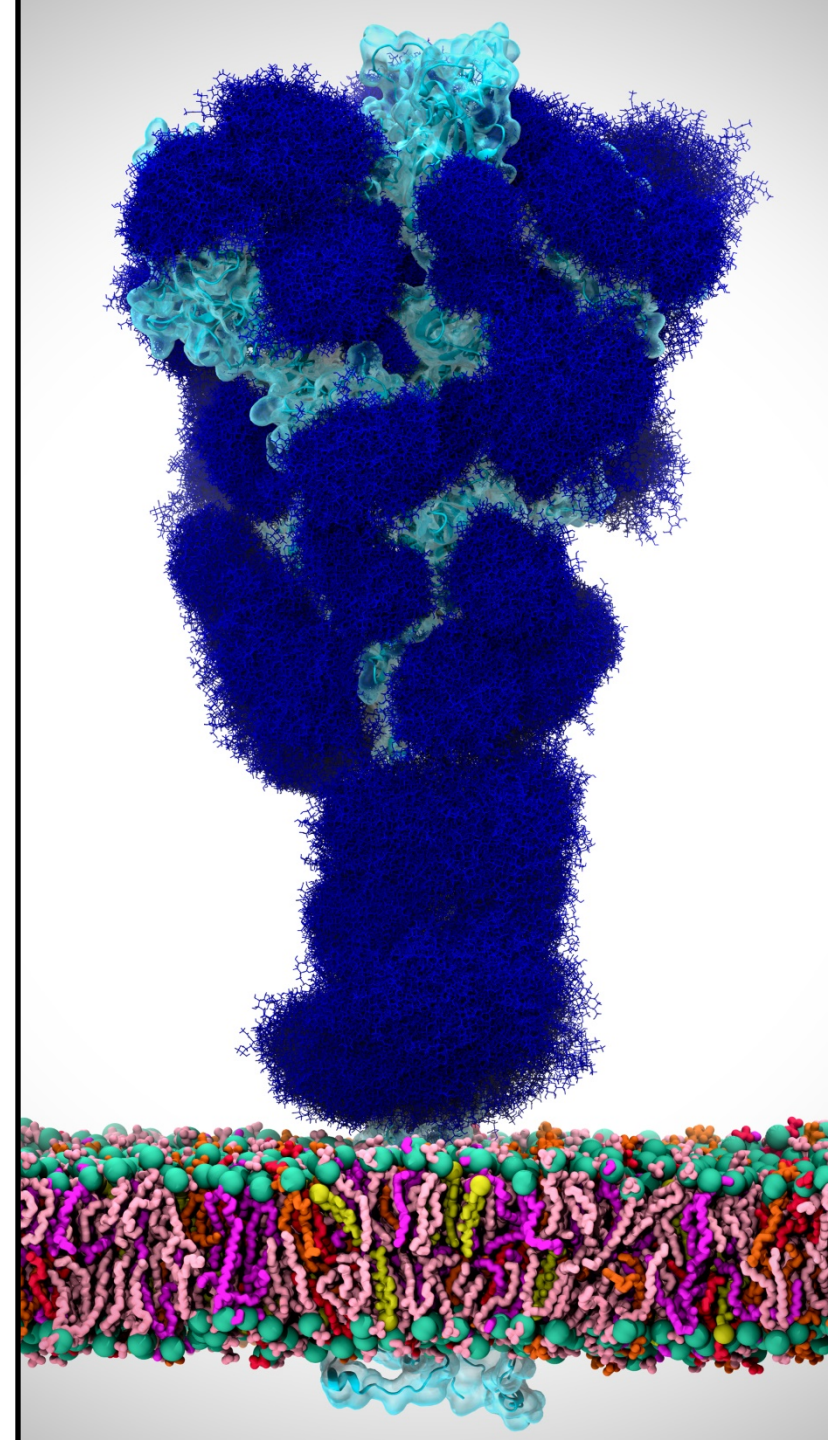
> 4 microseconds for each system



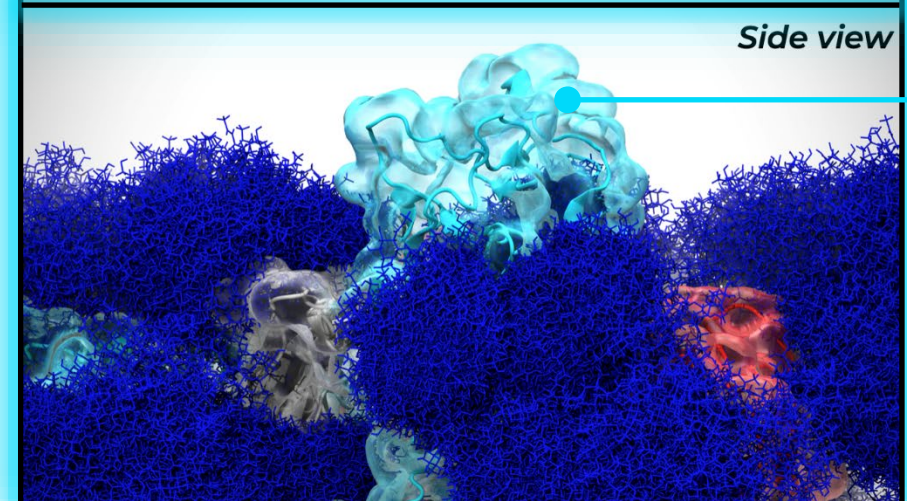
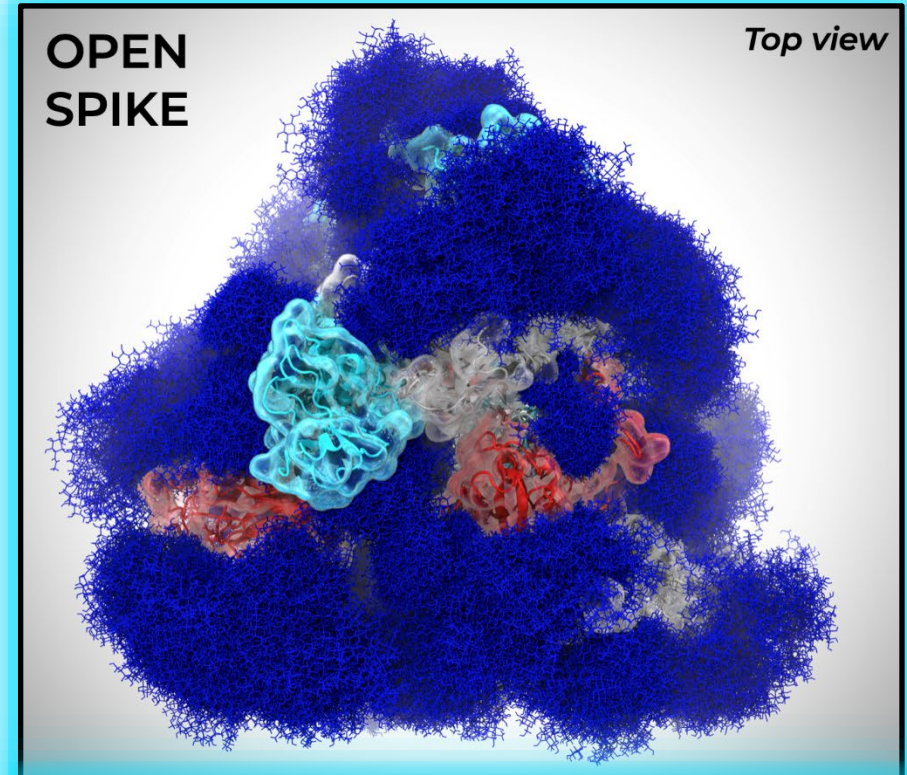
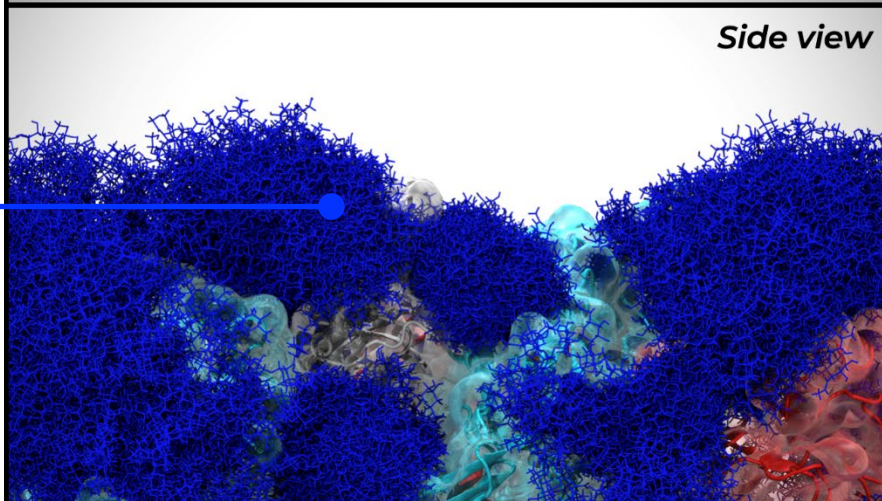
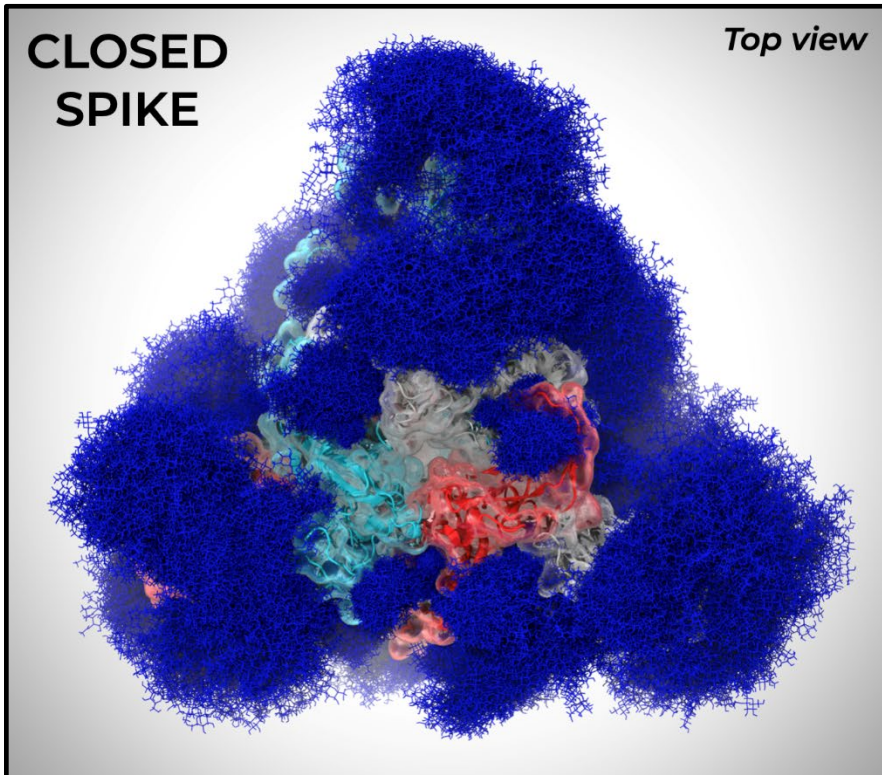
# The glycan shield

Simulations showed us the **glycan shield**, a sugary coat that experiments cannot see

This is crucial information for vaccine & drug design

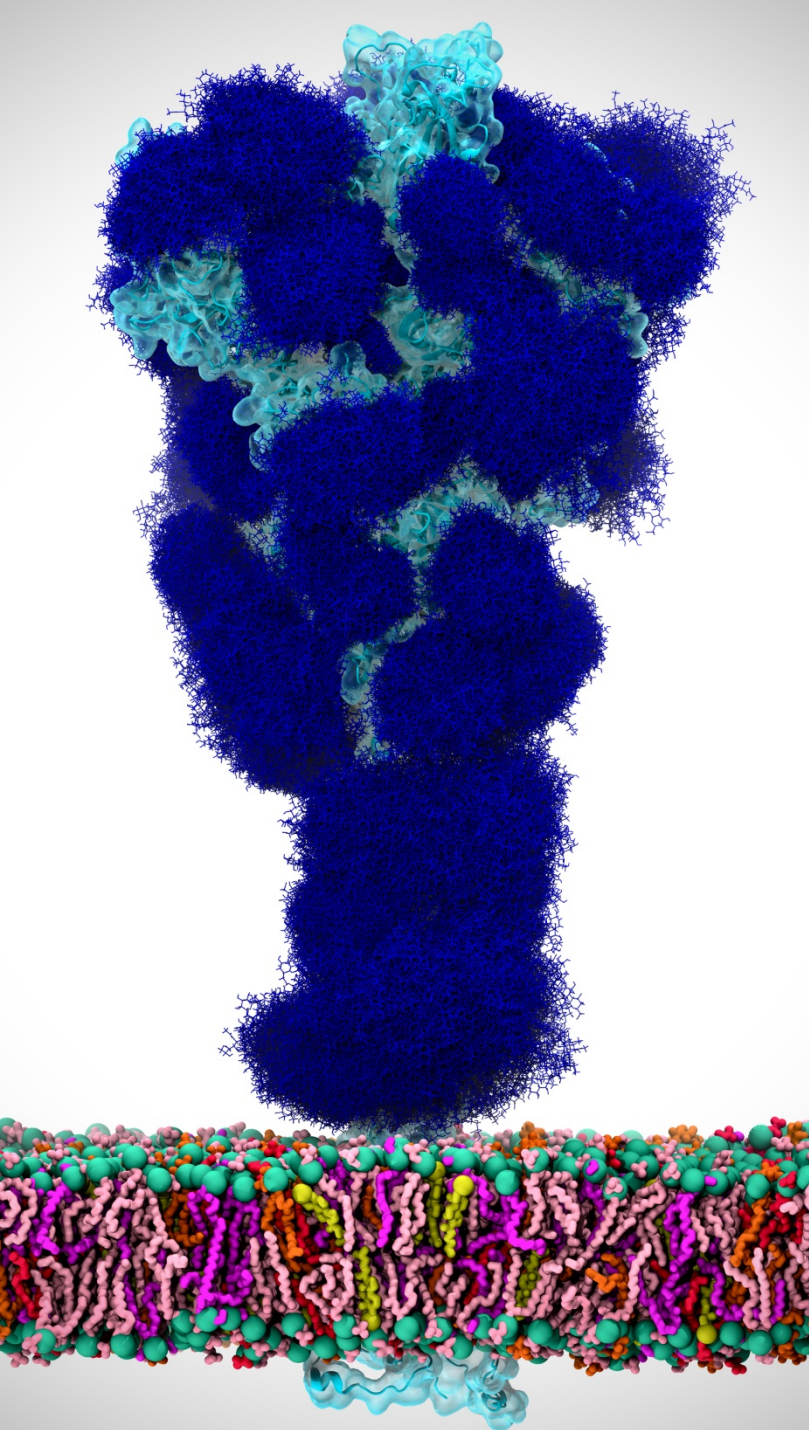


# Simulations showed WHY the spike opens and closes

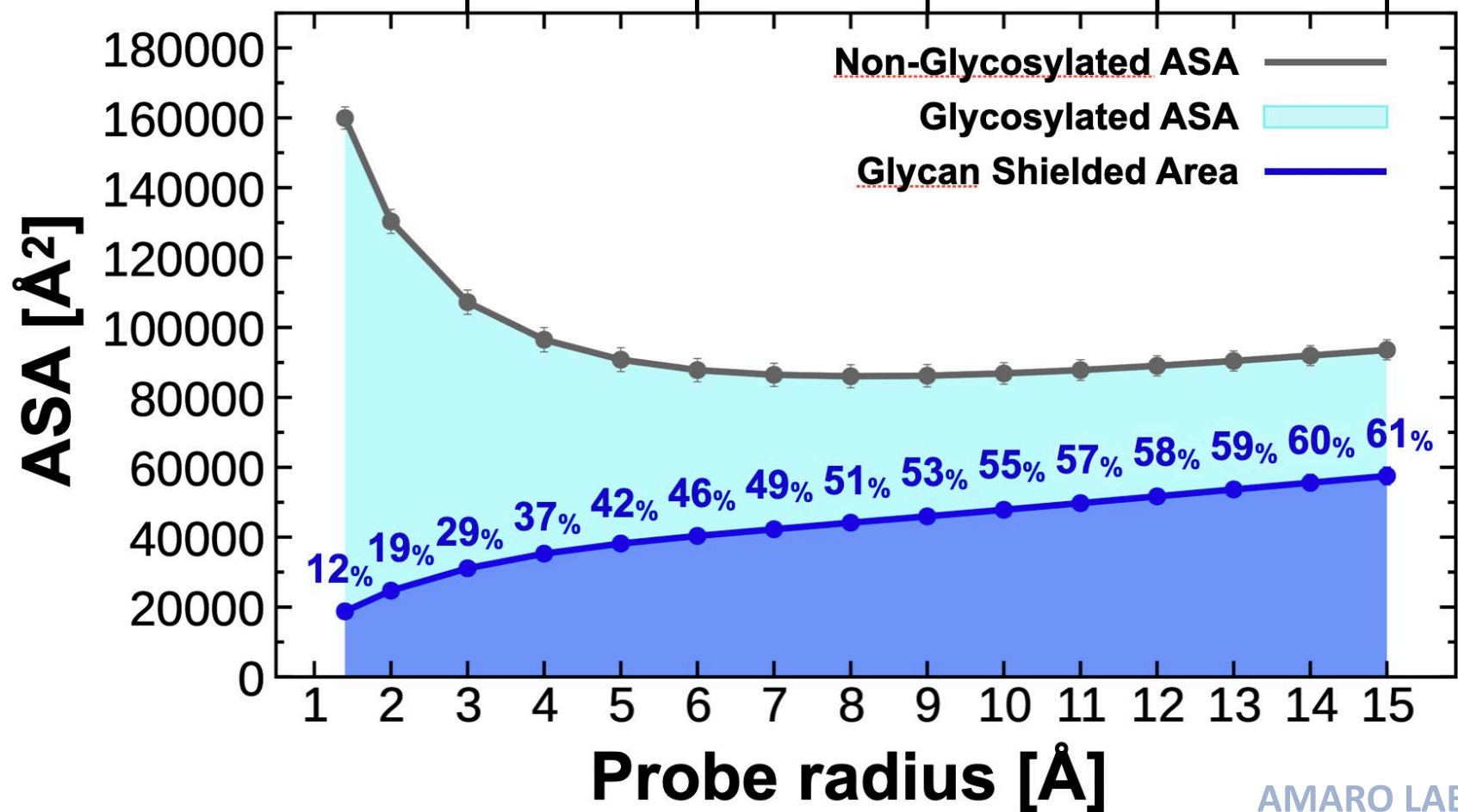
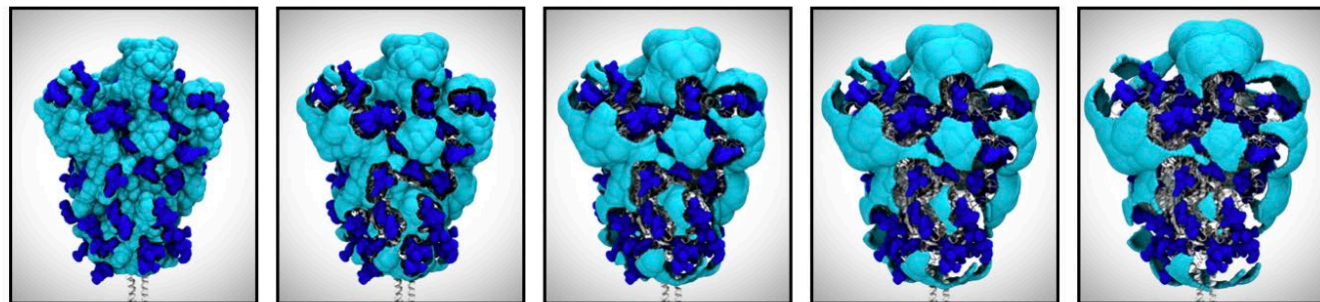


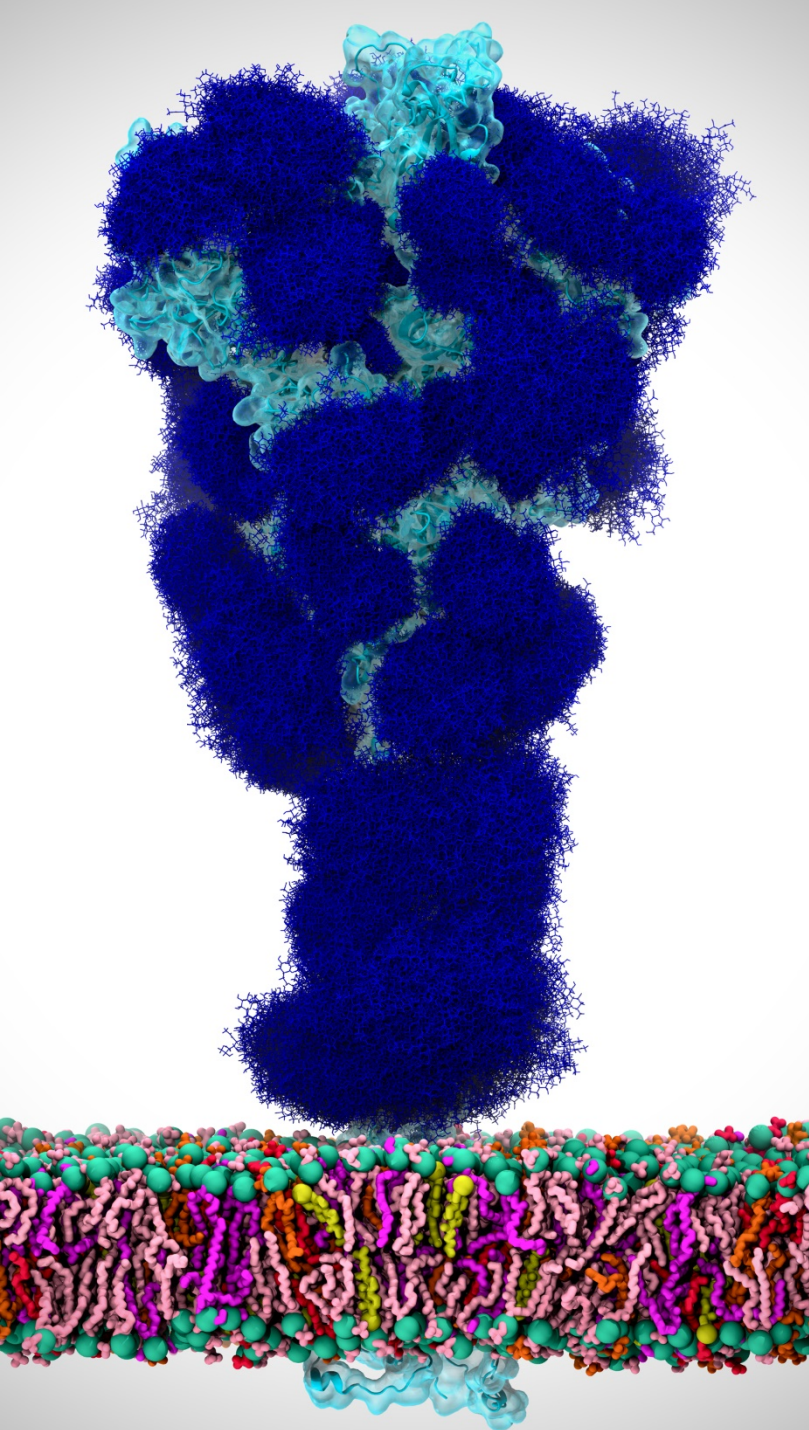
**Glycan shield**  
(defending mode)

**RBD open**  
(attacking mode)

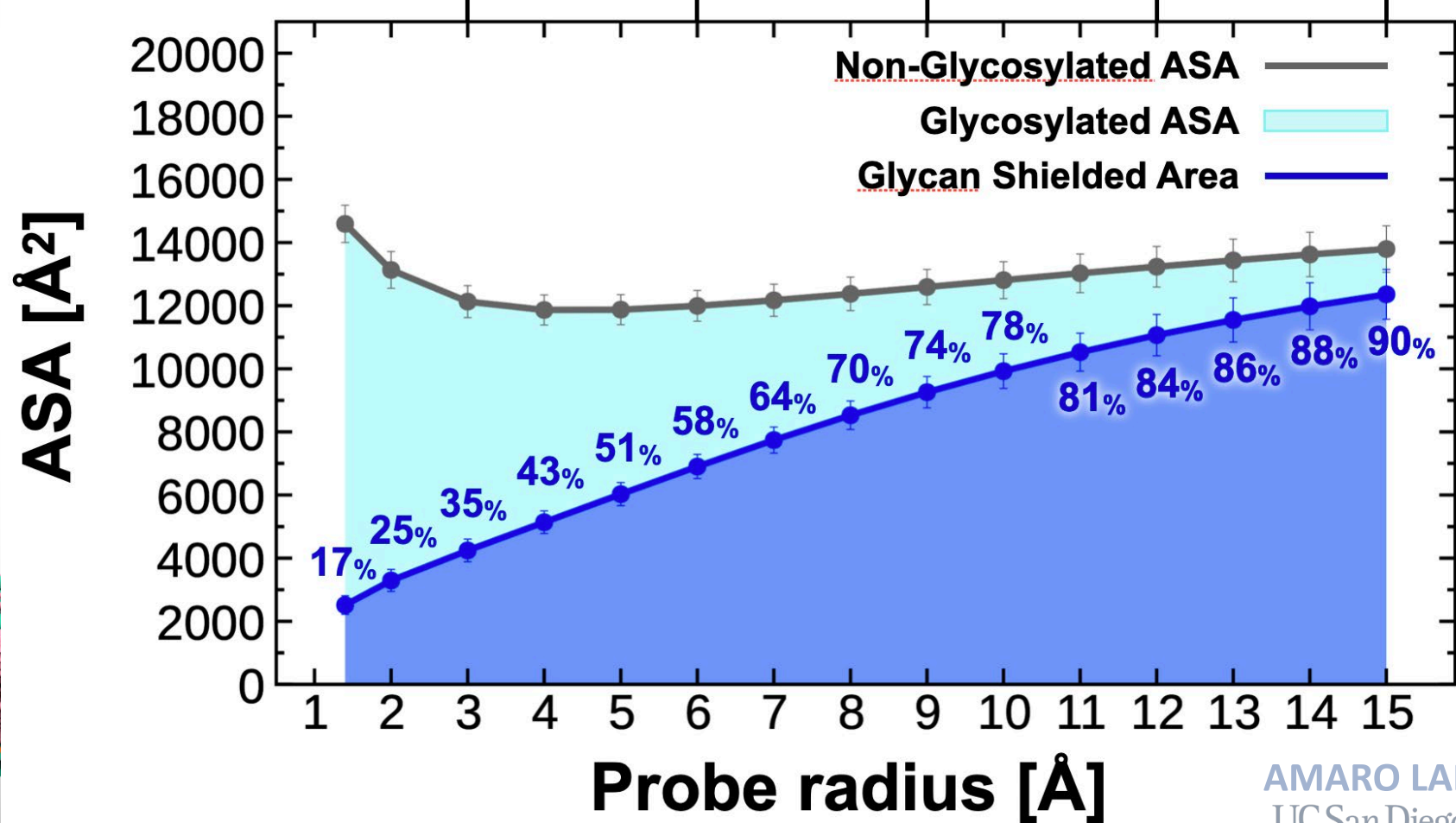
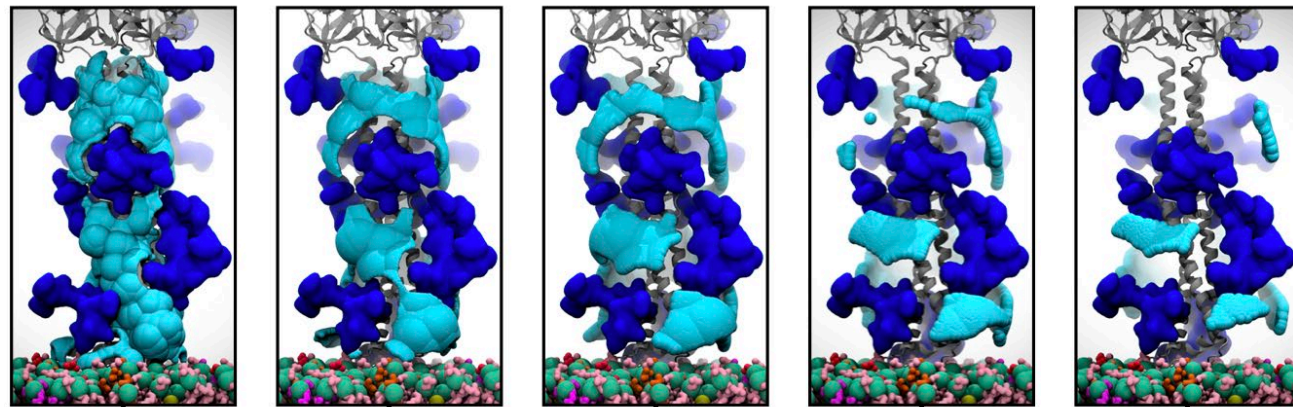


**head**

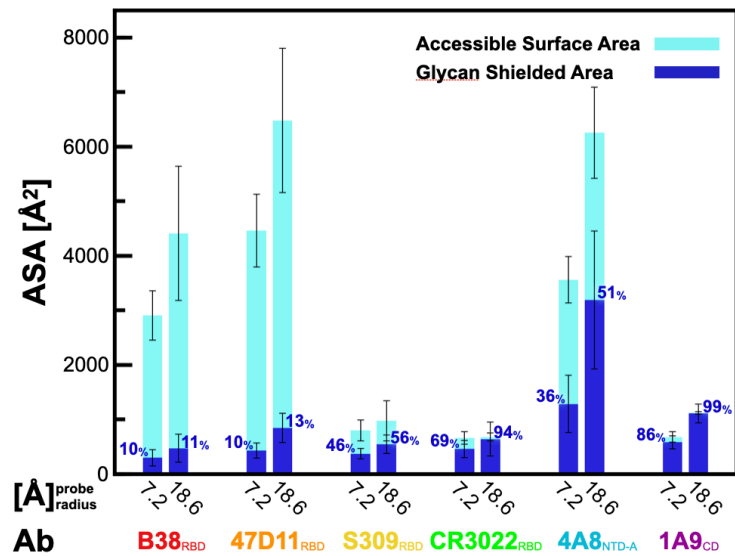




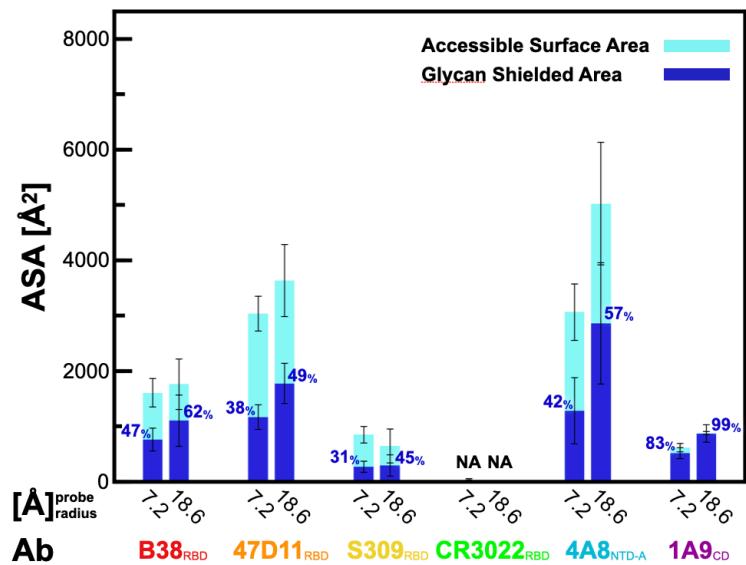
**stalk**



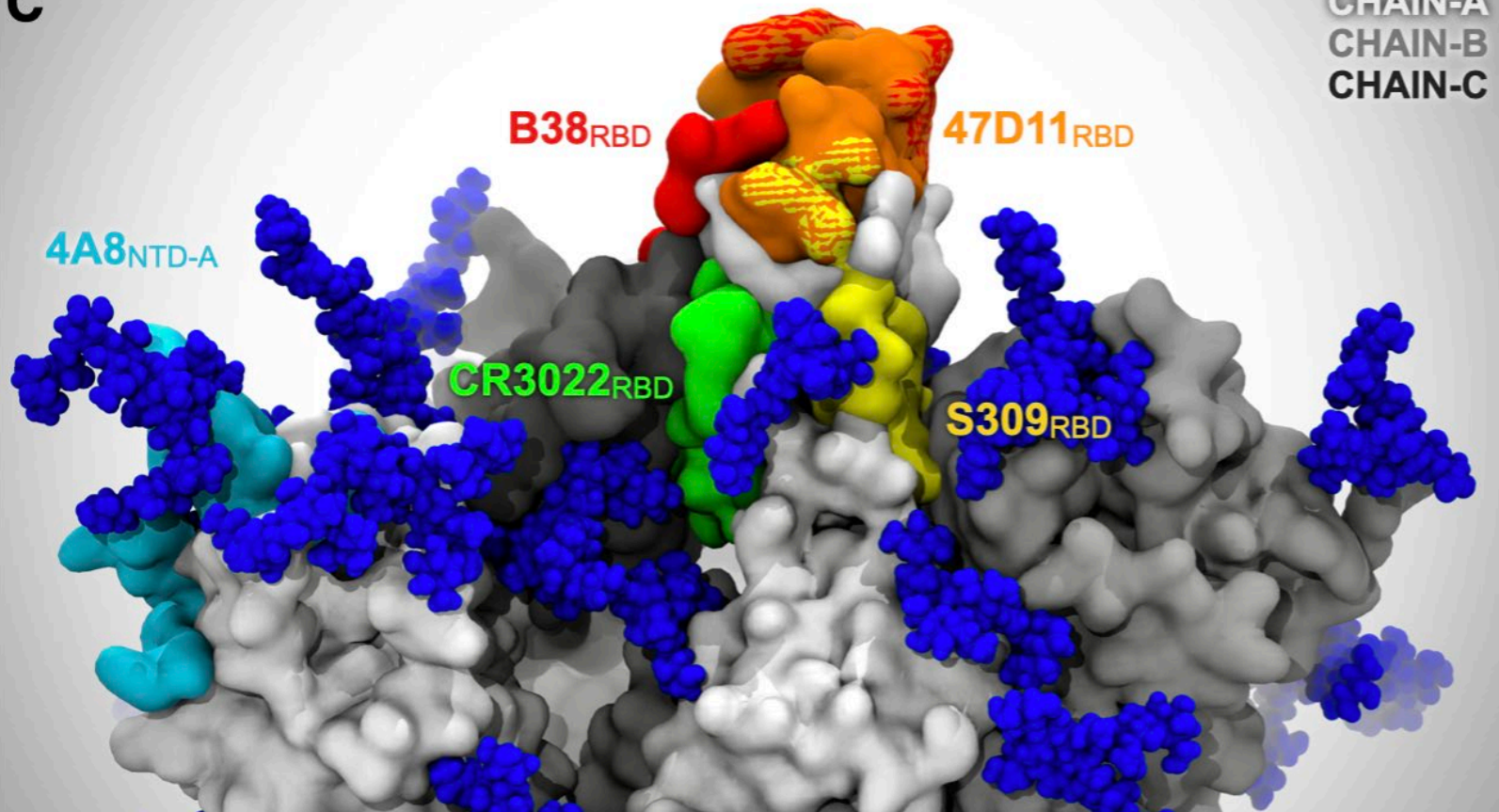
## CHAIN-A Open



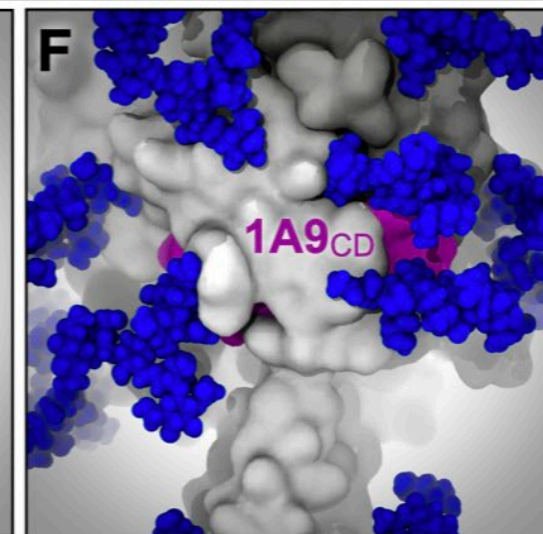
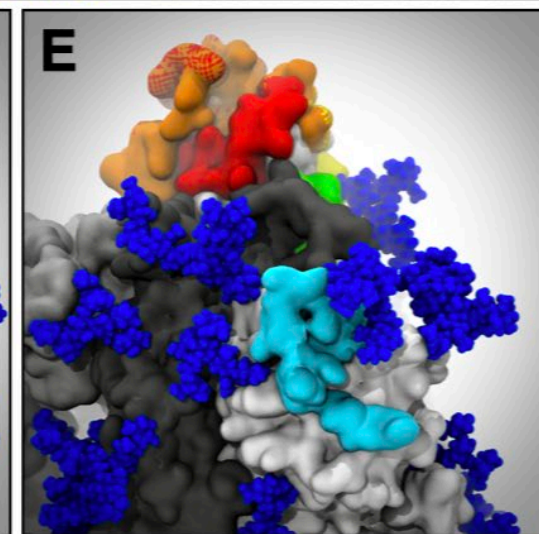
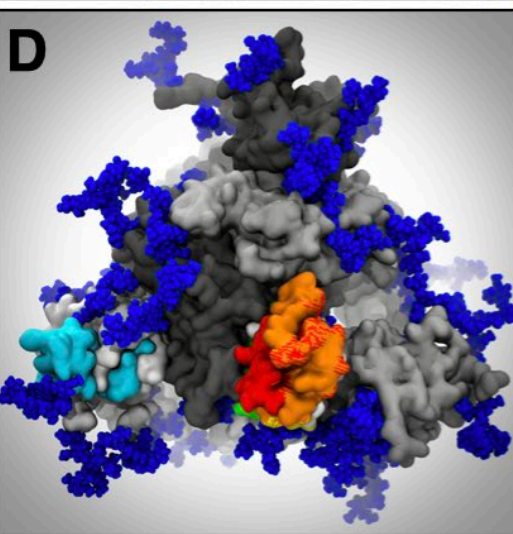
## CHAIN-A Closed



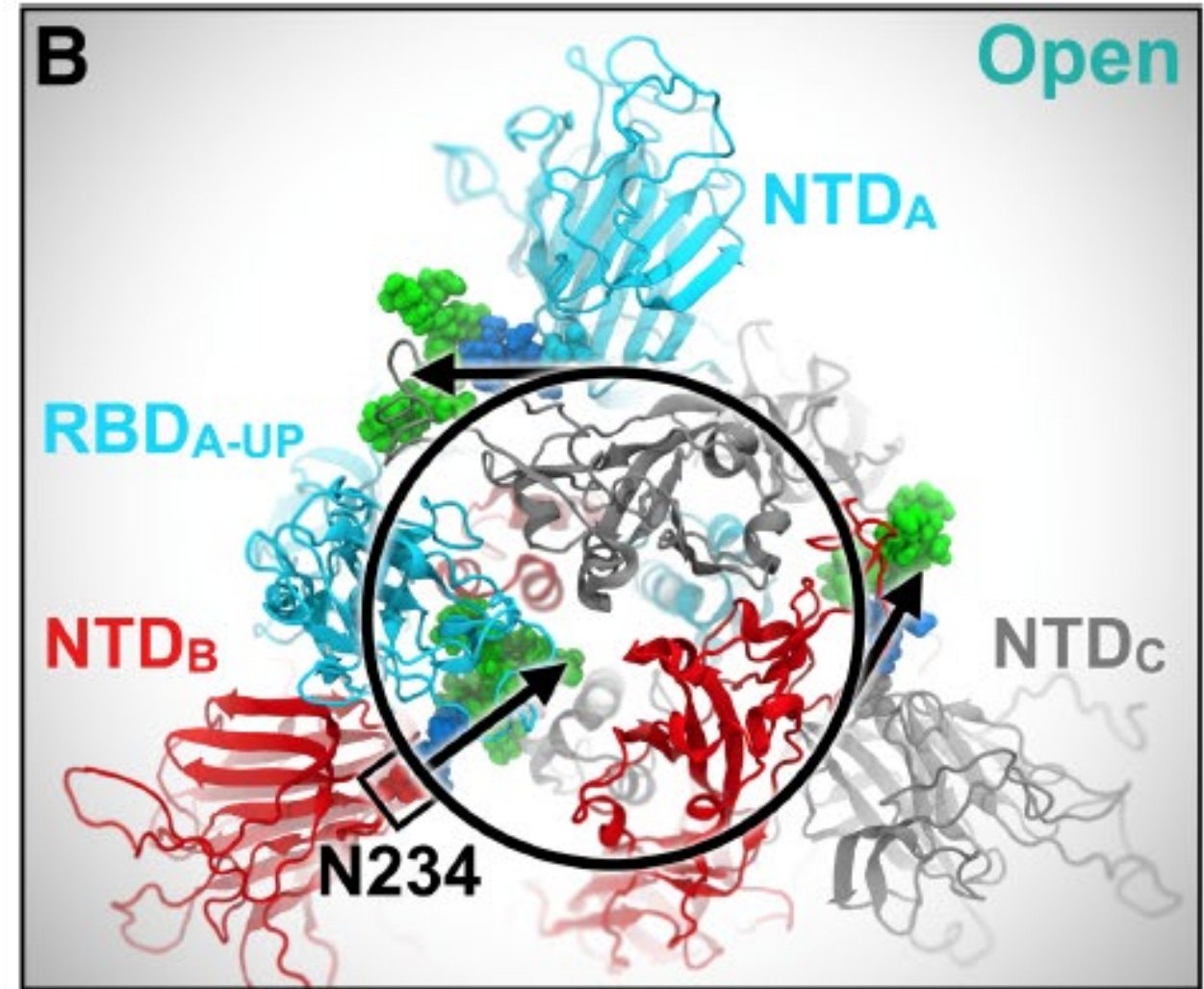
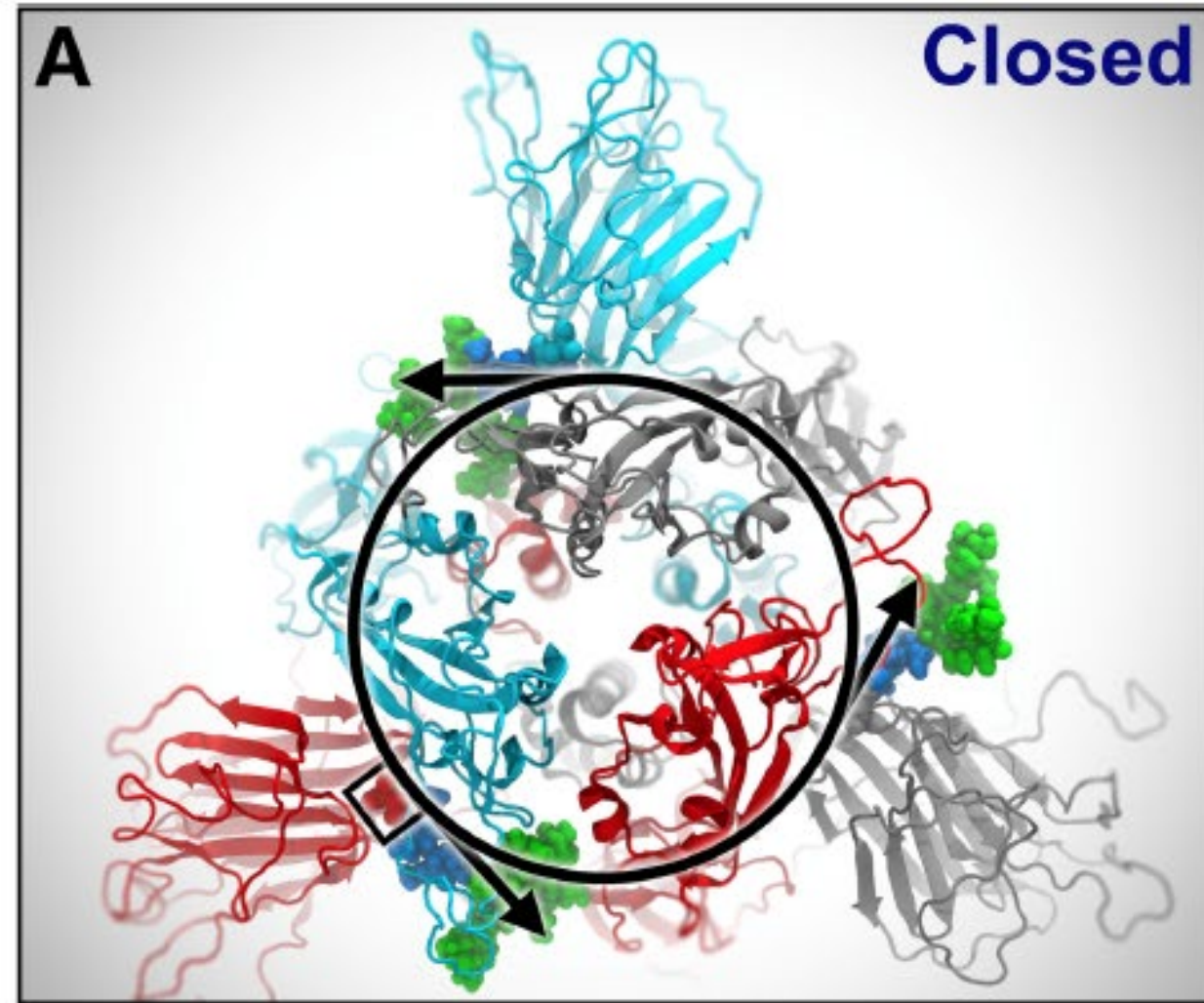
C



CHAIN-A  
CHAIN-B  
CHAIN-C



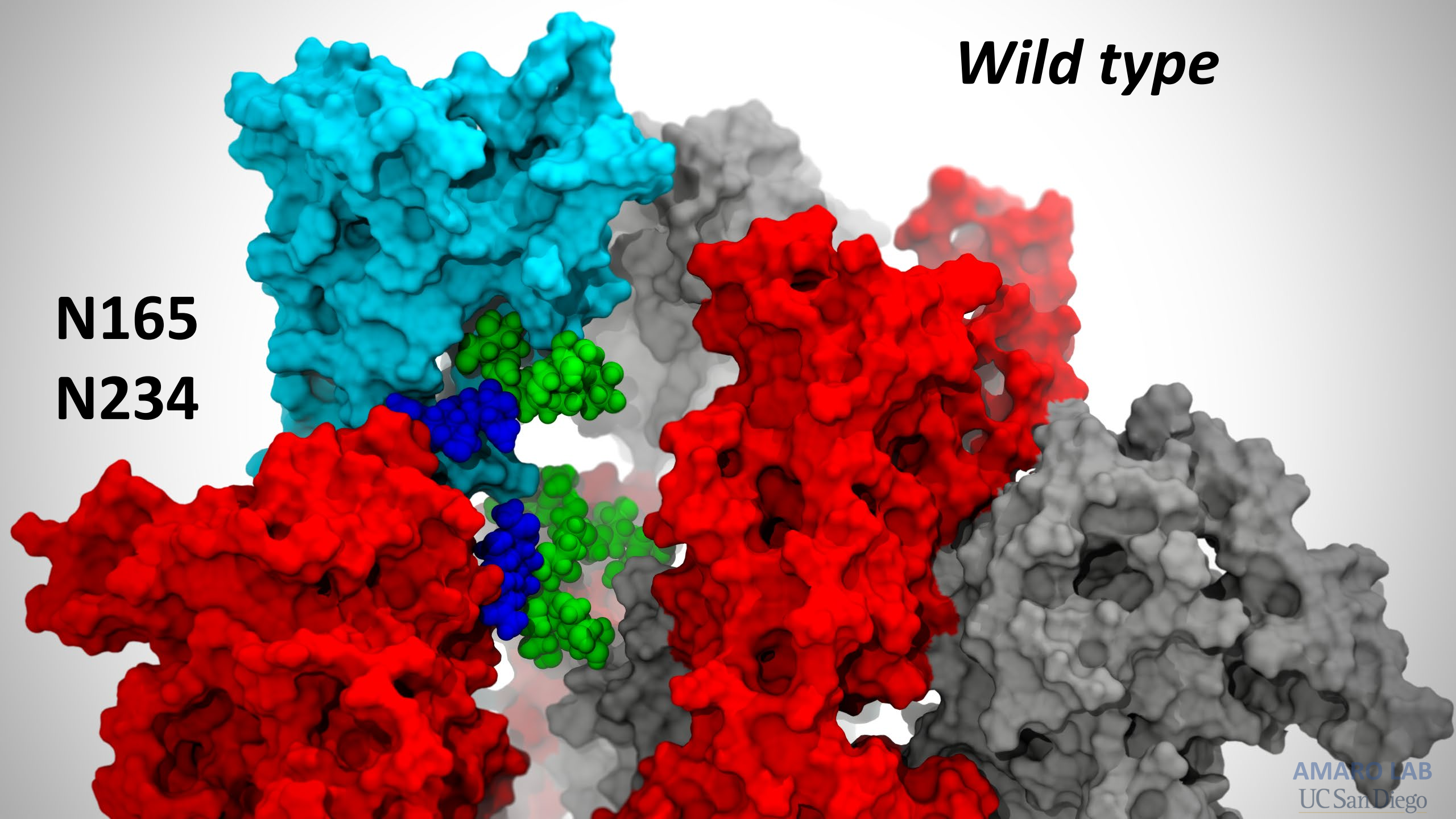
# Glycans: A Function Beyond Shielding?





*Wild type*

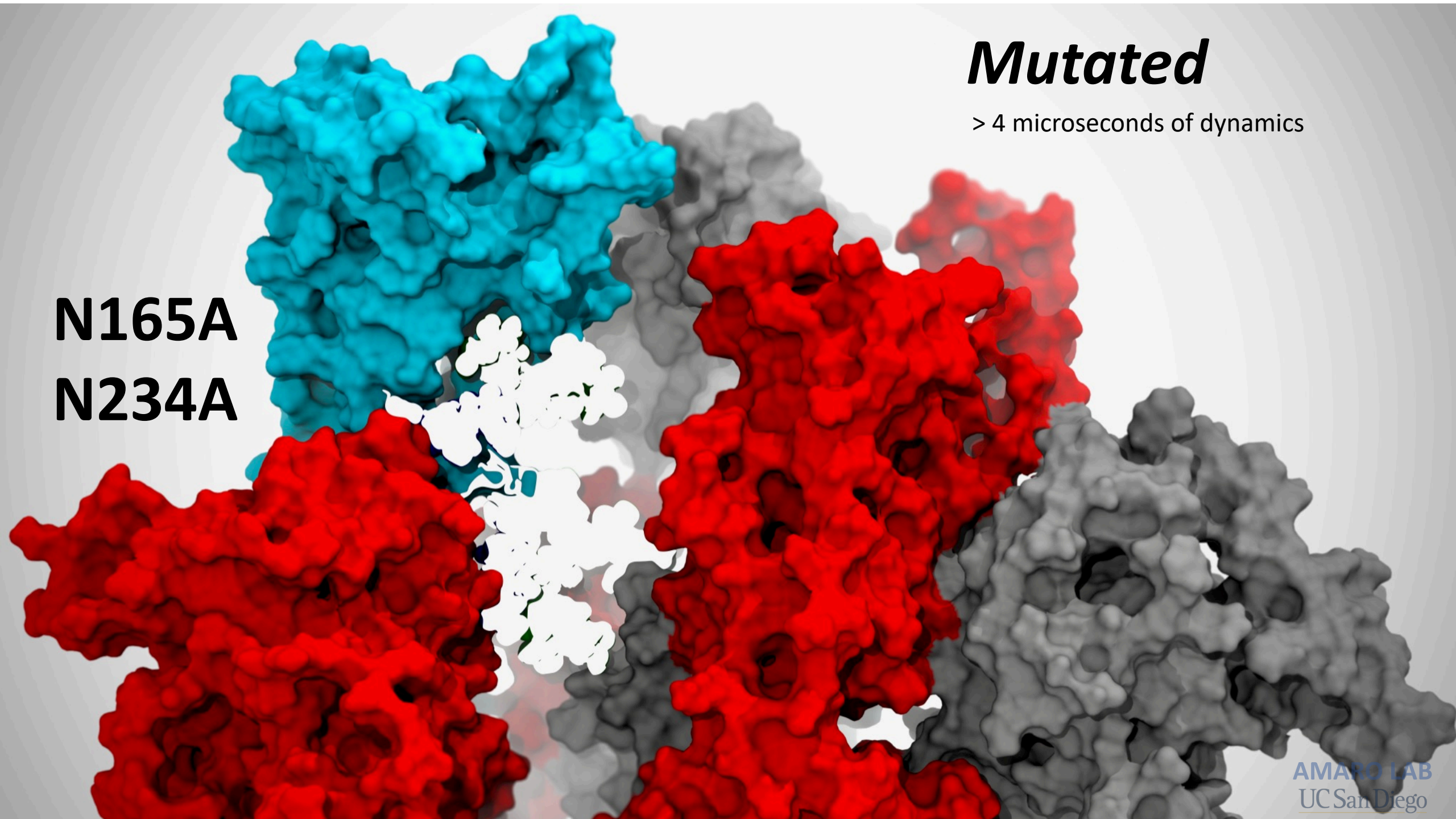
**N165**  
**N234**



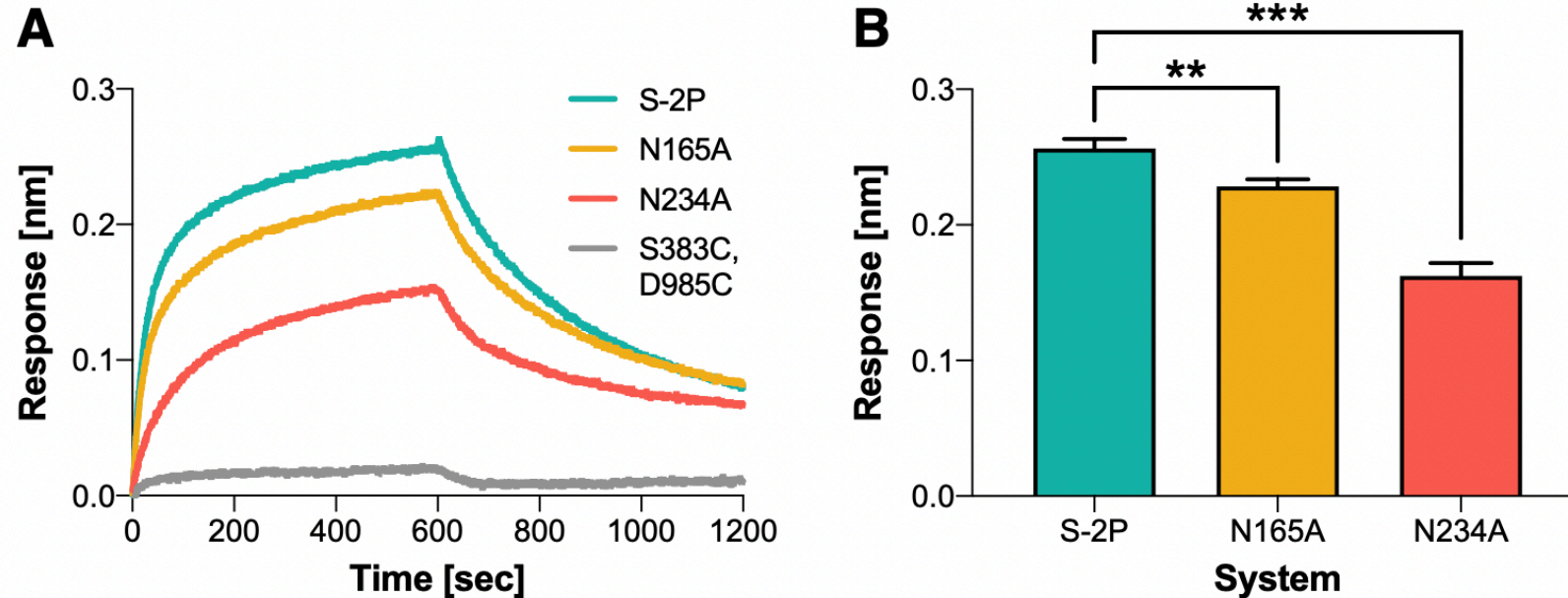
# ***Mutated***

> 4 microseconds of dynamics

**N165A**  
**N234A**



# McLellan Lab (UT Austin) Collaboration



**Figure 4. N234A and N165A mutations reduce RBD binding to ACE2.** (A) Biolayer interferometry sensorgrams showing binding of ACE2 to spike variants. (B) Binding responses for biolayer interferometry measurements of ACE2 binding to spike variants. Data are shown as mean  $\pm$  S.D. from 3 independent experiments. Asterisks represent statistical significance (Student's t test; \* $0.01 < p < 0.05$ , \*\* $0.001 < p < 0.01$ , \*\*\* $0.0001 < p < 0.001$ ).

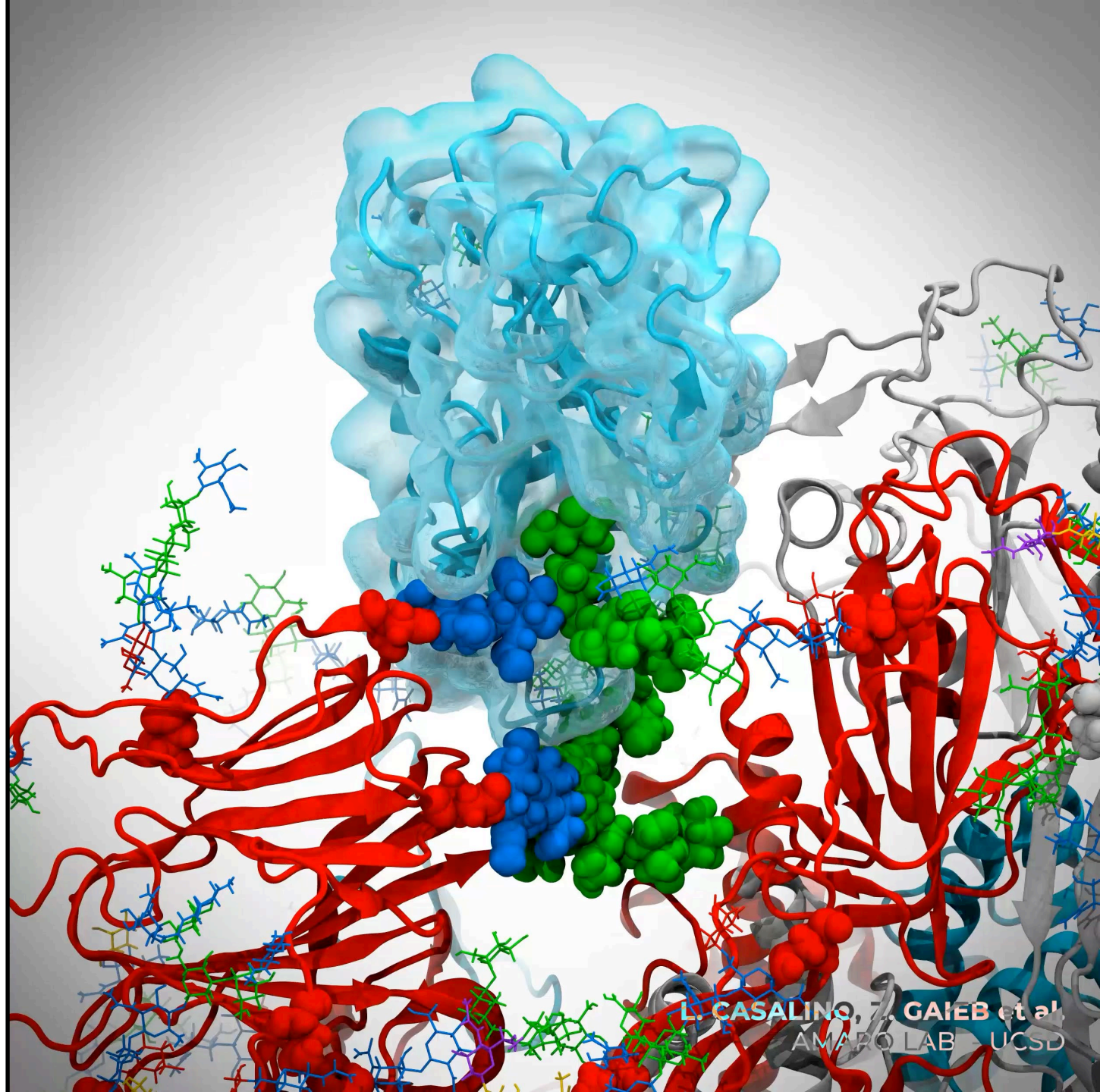
# BEYOND shielding...

Simulations established a structural role for glycans

- They act as part of the viral weaponry itself
- They “**lock & load**” the spike for infection



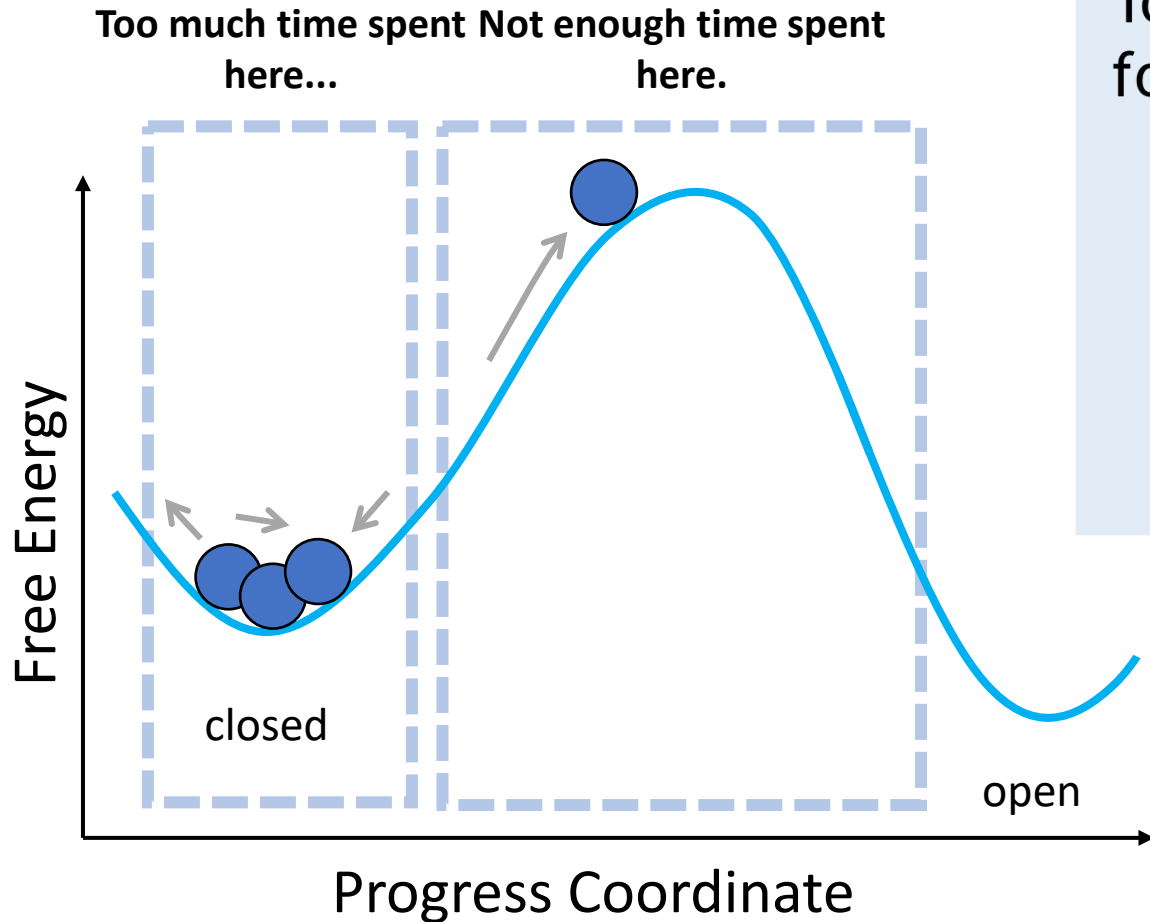
Casalino, Gaieb et al., *ACS Central Science* (2020)



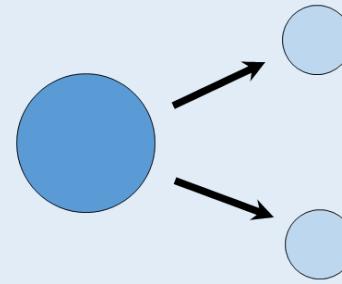
L. CASALINO, Z. GAIEB et al.  
AMARO LAB - UCSD

# Standard MD simulations of spike opening could take years!

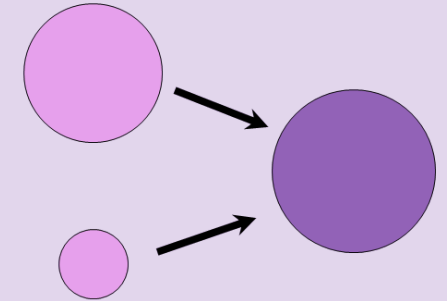
## Weighted ensemble MD focuses on functional transitions



To enrich  
for success...



To save  
computing power...



Huber and Kim, *Biophys. Journal* (1996)  
Zuckerman and Chong, *Ann. Rev. Biophys.* (2017)

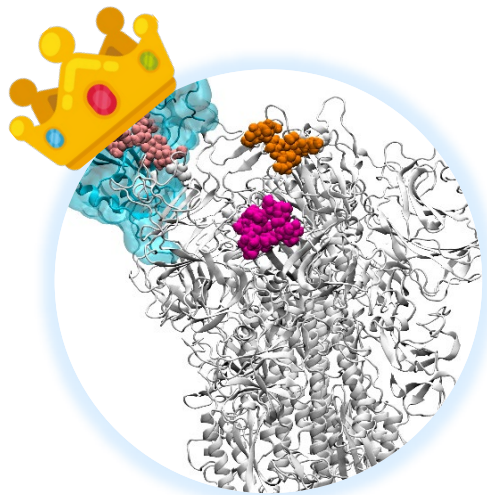
Generates **unbiased, continuous** pathways with **orders of magnitude less computing** than standard MD.

**Efficiency scales exponentially** with the free energy barrier.

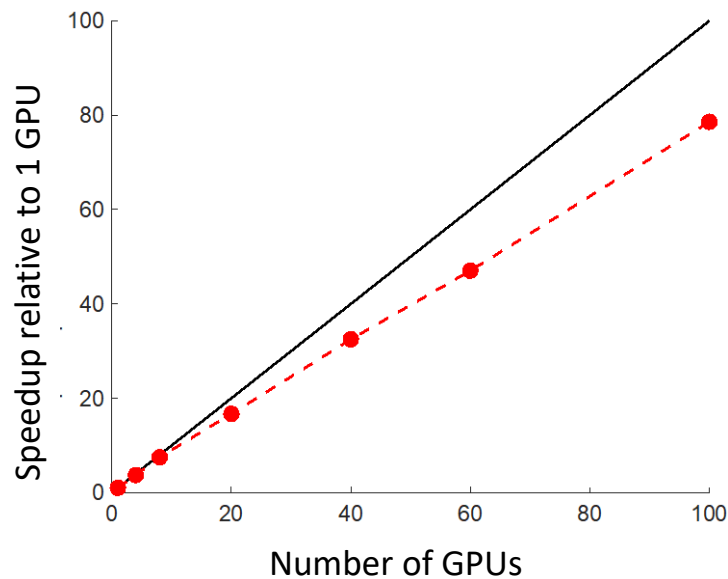


# The Weighted Ensemble Simulation Toolkit with Parallelization and Analysis

**Weighted ensemble MD is 13x to 127x more efficient than standard MD!**



600K atoms



## AMBER MD



100 NVIDIA V100 GPUs  
on Longhorn

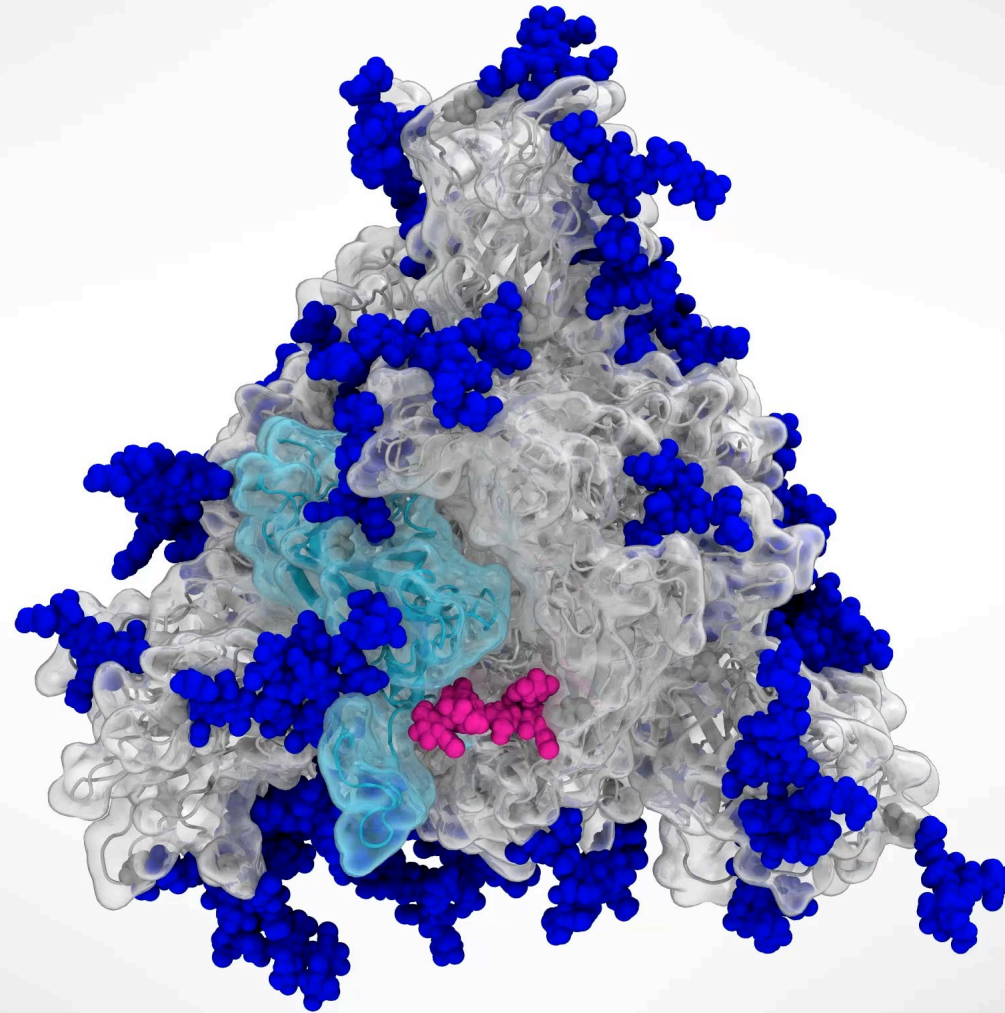
Zwier et. Al., *JCTC* (2015)

	Weighted Ensemble MD	Standard MD
Number of pathways	1193*	100
Wall-clock time	23 days	10 months to 8 years ( $\mu$ s to ms)
Total node-hours	13,800	180,000 to 1,752,000

\*133 are independent (uncorrelated in time)

# Closed Spike

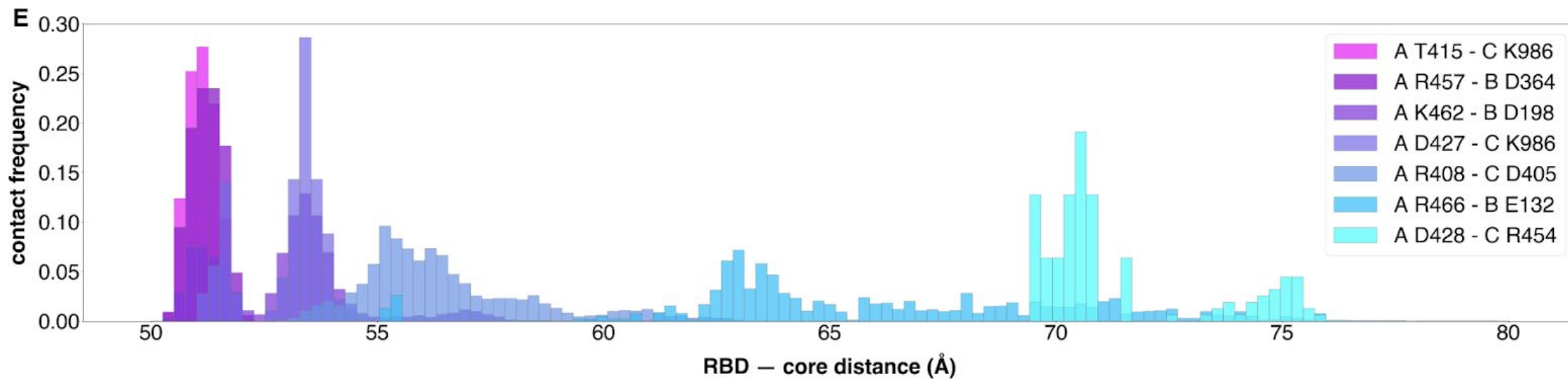
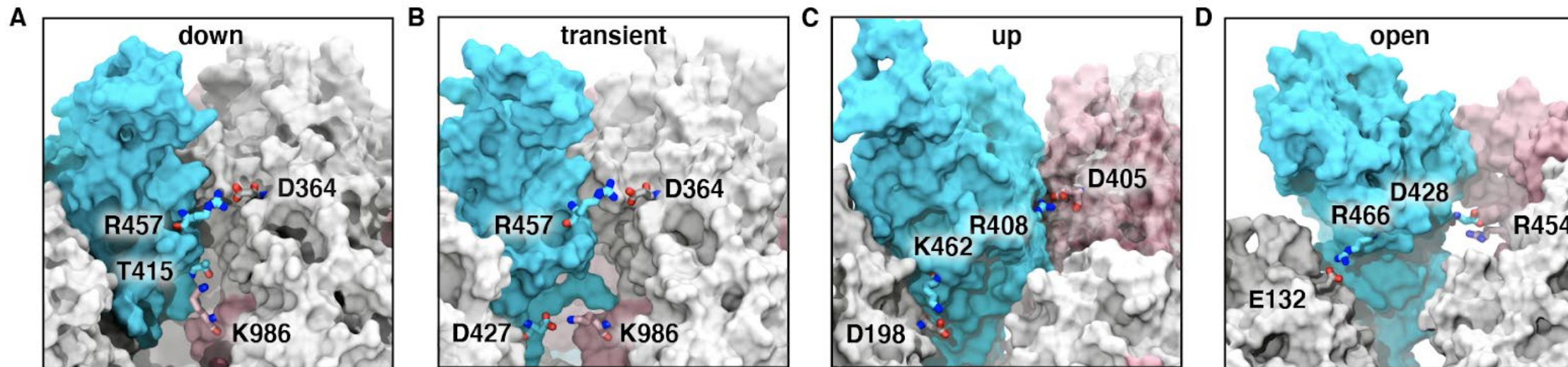
*Top view*



MOVIE BY L. CASALINO

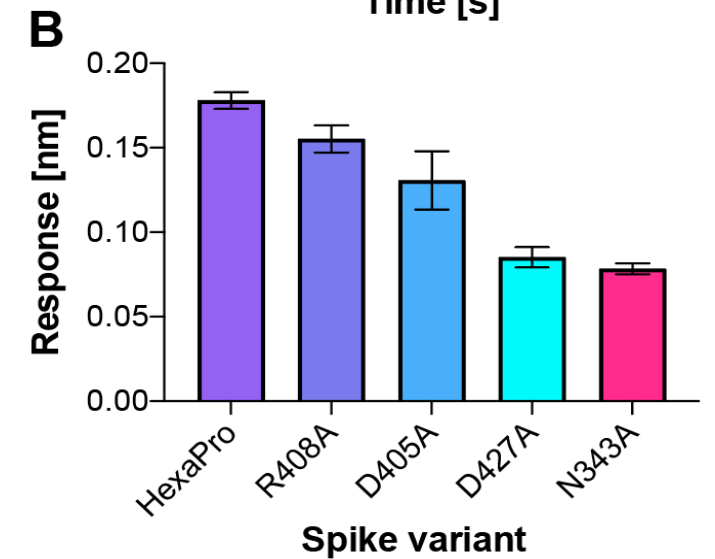
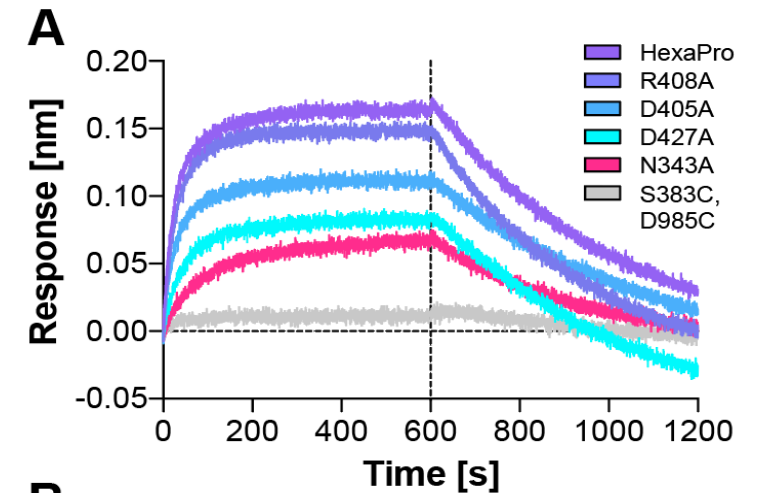
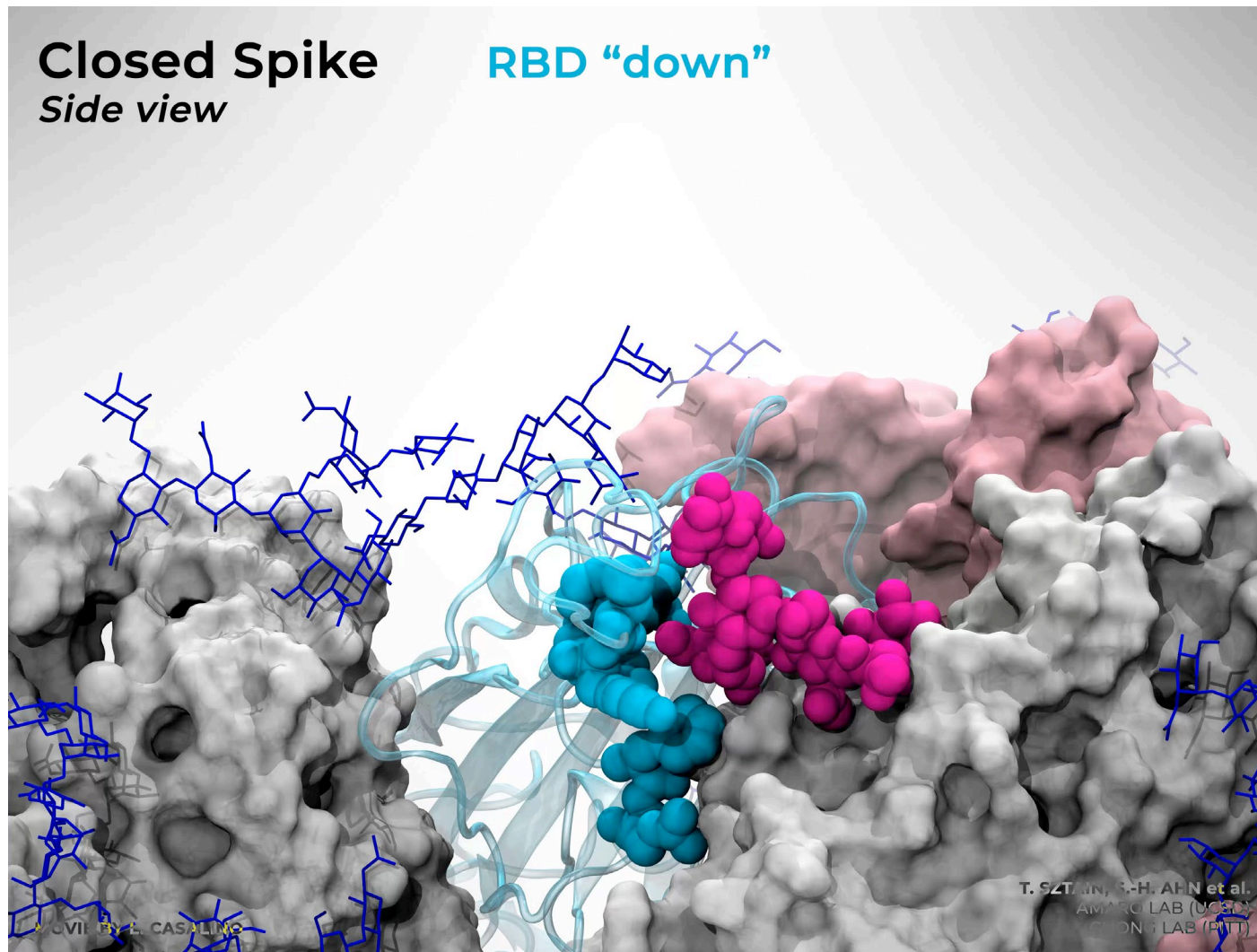
**T. SZTAIN, S.-H. AHN et al.**  
AMARO LAB (UCSD)  
CHONG LAB (PITT)

# Interactions along the opening pathway



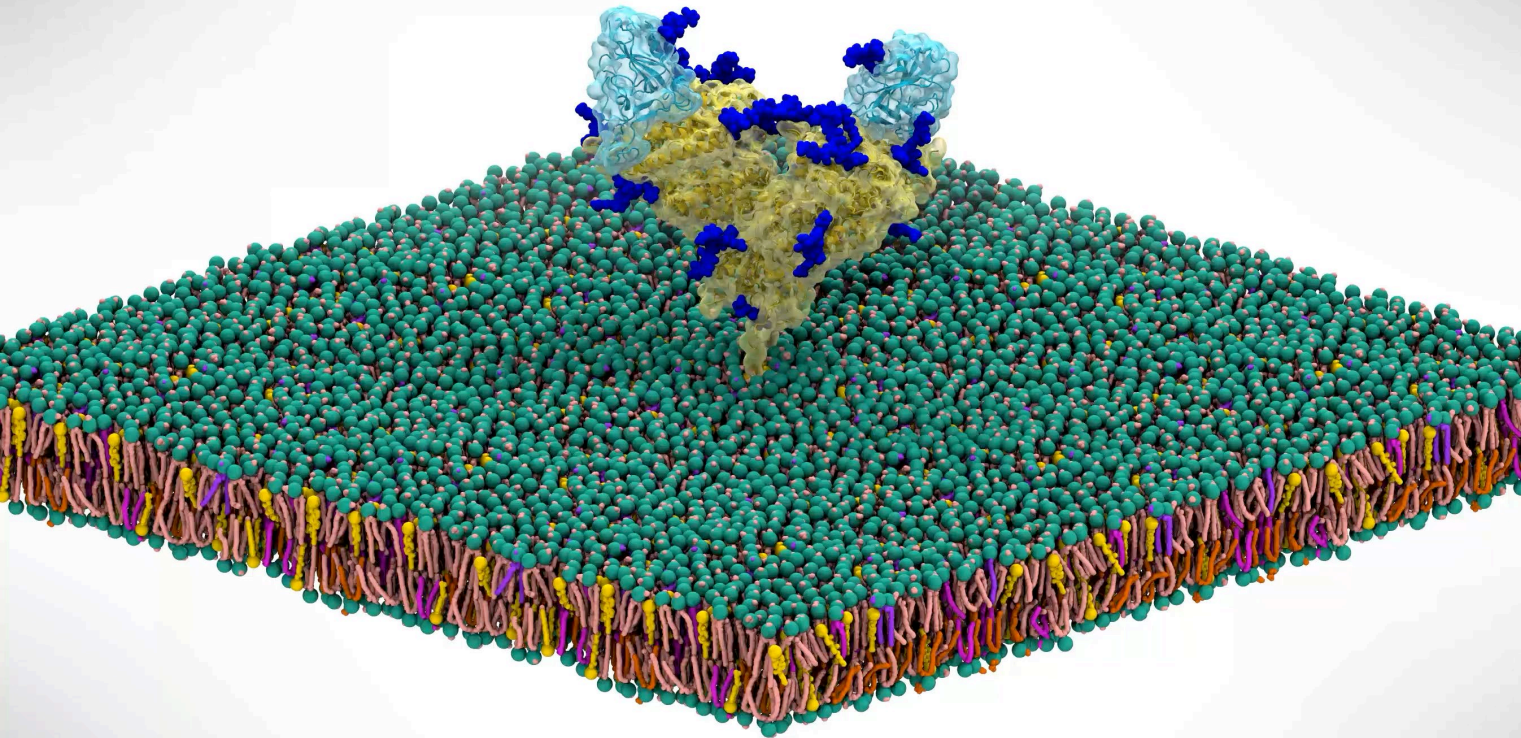


# A glycan gate controls opening of SARS-CoV-2 spike



**McLellan Lab (UT Austin)  
Collaboration**

# ACE2/RBD complex

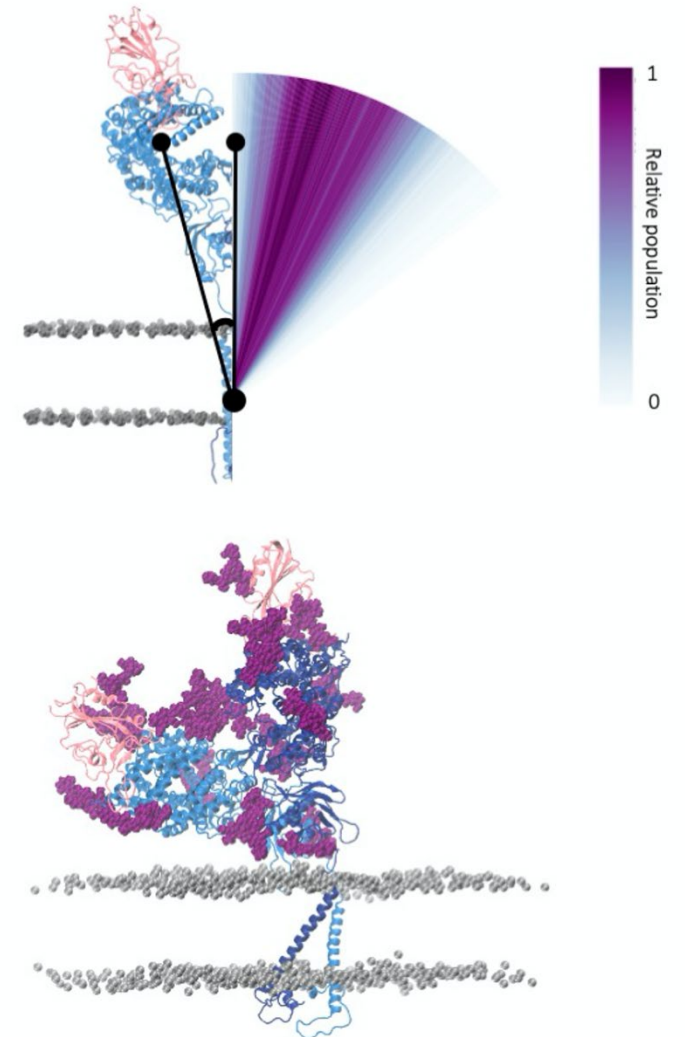


**E. P. BARROS et al.**  
AMARO LAB - UCSD

## The Flexibility of ACE2 in the Context of SARS-CoV-2 Infection

Emilia P. Barros,<sup>1</sup> Lorenzo Casalino,<sup>1</sup> Zied Gaieb,<sup>1</sup> Abigail C. Dommer,<sup>1</sup> Yuzhang Wang,<sup>2</sup> Lucy Fallon,<sup>2</sup> Lauren Raguette,<sup>2</sup> Kellon Belfon,<sup>2</sup> Carlos Simmerling,<sup>2,3</sup> and Rommie E. Amaro<sup>1,\*</sup>

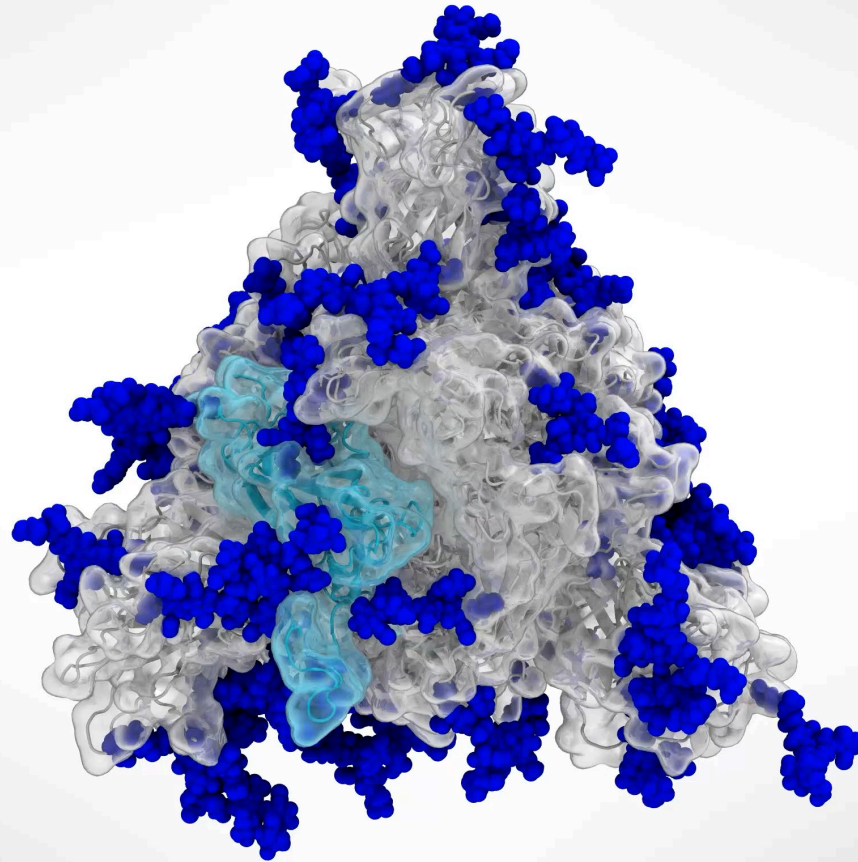
<sup>1</sup>Department of Chemistry and Biochemistry, University of California, San Diego, La Jolla, California; <sup>2</sup>Department of Chemistry and <sup>3</sup>Laufer Center for Physical and Quantitative Biology, Stony Brook University, Stony Brook, New York



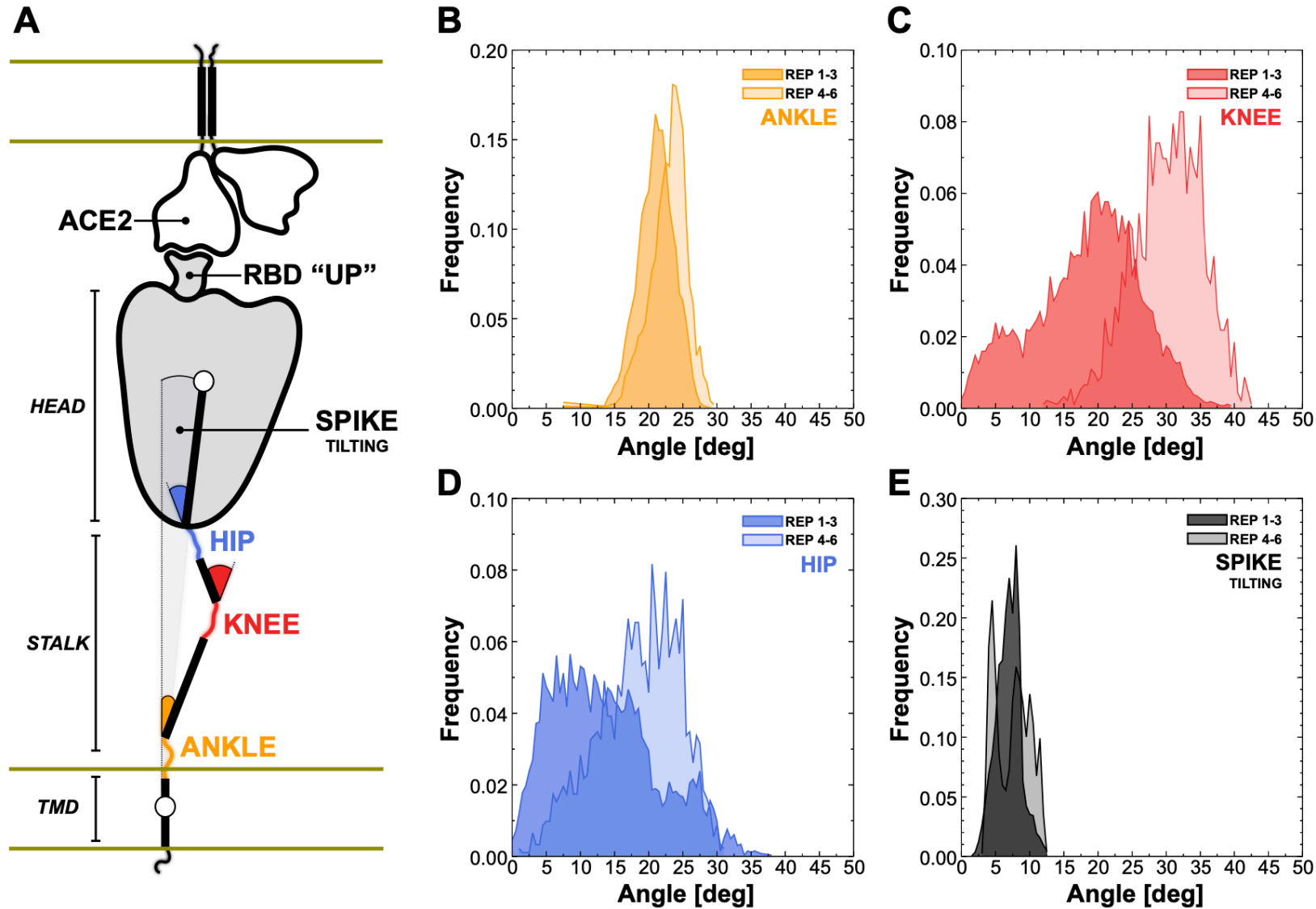
# Weighted ensemble simulations show HOW the spike opens & AI acts as a multiscale 'glue' to bridge capability gaps

## Closed Spike

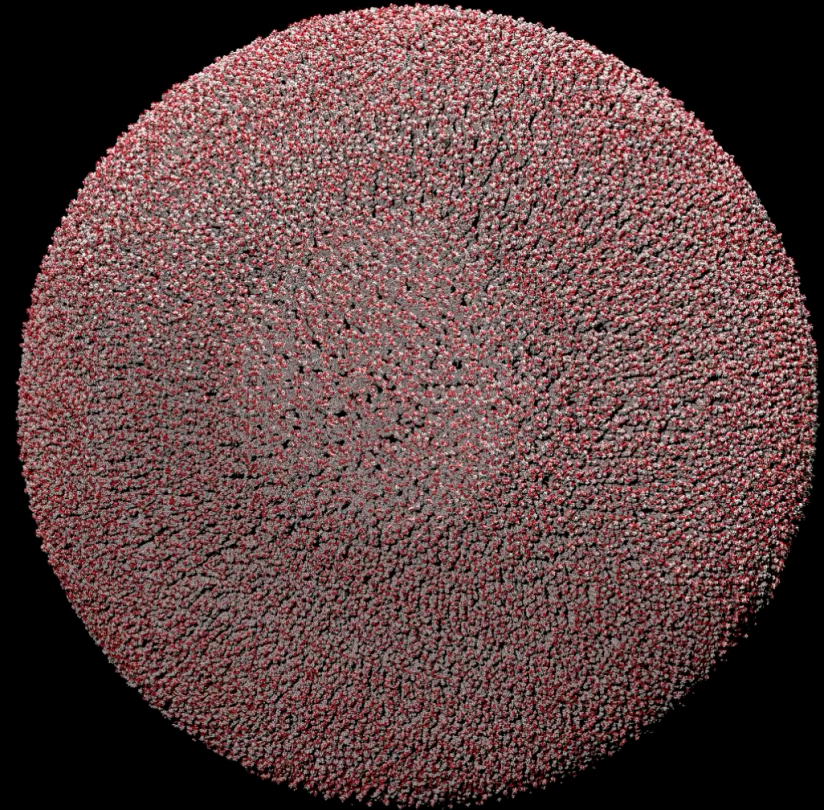
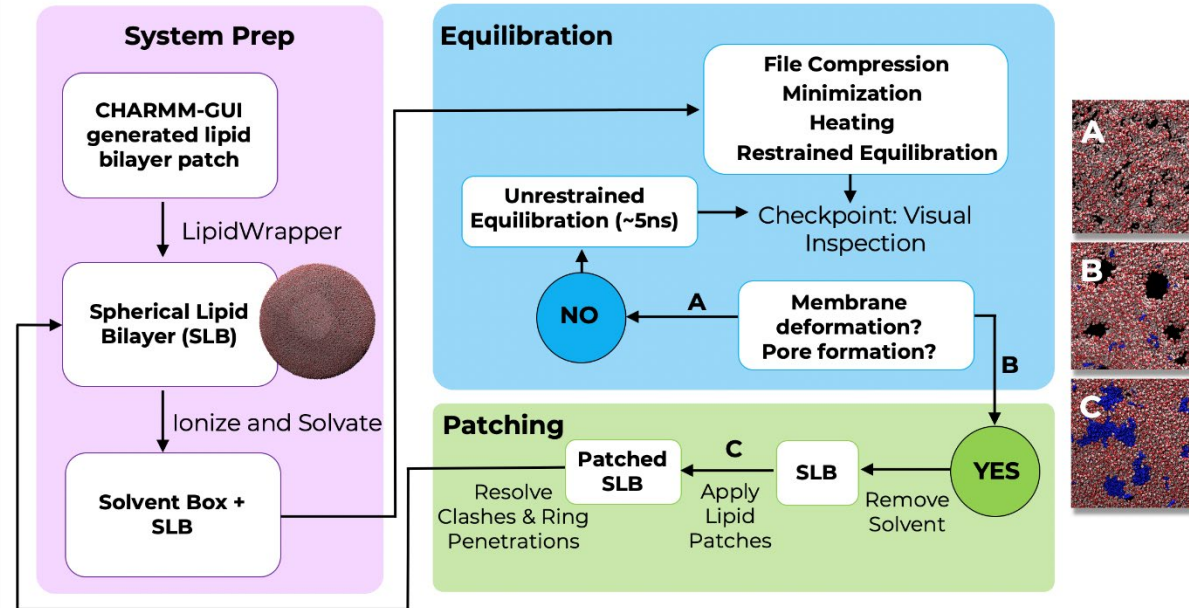
*Top view*



# Flexible hinges in spike stalk aid mechanics of binding & cell fusion



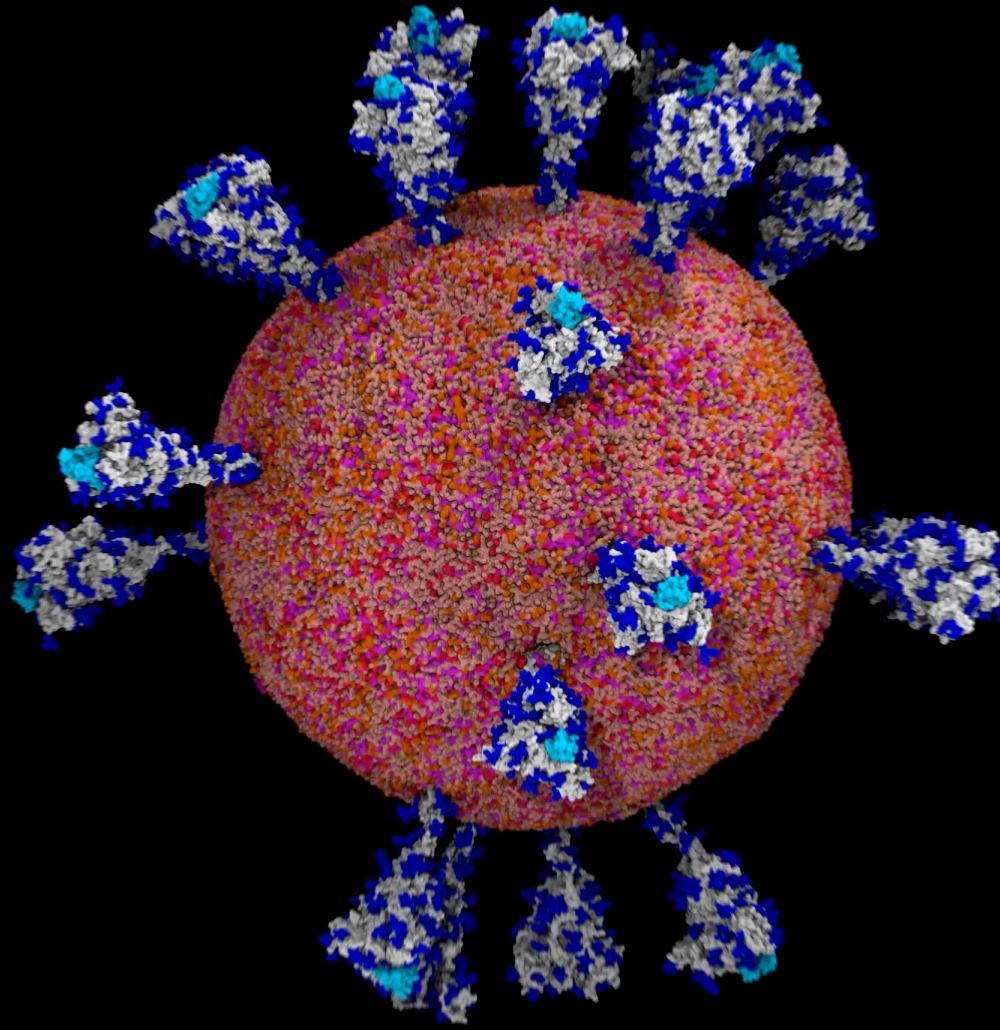
# Building the entire SARS-CoV-2 viral envelope



**Intensive, iterative remodeling process required**

**Patch 0**

# New dimensions for studying viral infection and therapeutics



SHARE

IN DEPTH | COVID-19



# New mutations raise specter of 'immune escape'



Kai Kupferschmidt

+ See all authors and affiliations



Science 22 Jan 2021:

Vol. 371, Issue 6527, pp. 329-330

DOI: 10.1126/science.371.6527.329

## Rapid assessment of (escape) mutants & Variants of Concern

CSH Cold Spring Harbor Laboratory

bioRxiv THE PREPRINT SERVER FOR BIOLOGY

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bioRxiv is receiving many new papers on coronavirus SARS-CoV-2. A reminder: these are preliminary reports that have not been peer reviewed, have not been certified by peer review, and may represent practice/health-related behavior, or be reported in news media as established information.

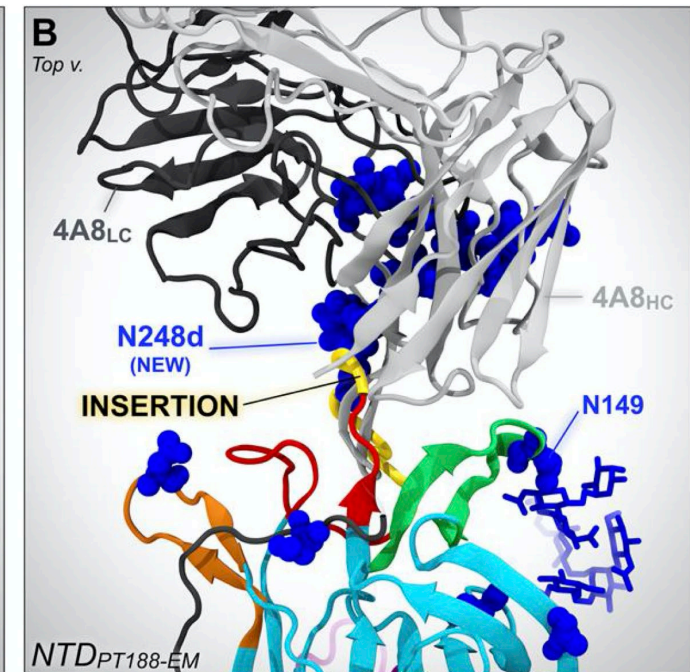
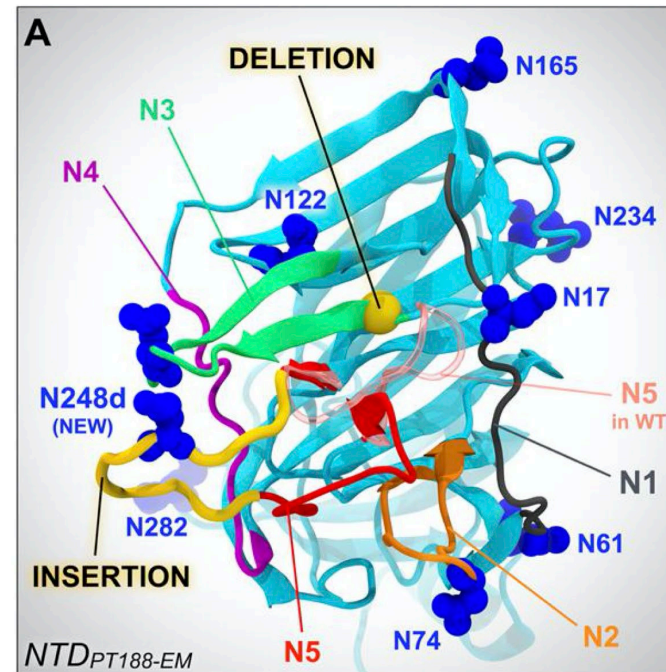
New Results [Comments \(4\)](#)

### SARS-CoV-2 escape *in vitro* from a highly neutralizing COVID-19 convalescent plasma

© Emanuele Andreano, Giulia Piccini, Danilo Licastro, © Lorenzo Casalino, Nicole V. Johnson, Ida Paciello, Simeone Dal Monego, Elisa Pantano, Noemi Manganaro, © Alessandro Manenti, Rachele Manna, Elisa Casa, Inesa Hyseni, Linda Benincasa, Emanuele Montomoli, © Rommie E. Amaro, © Jason S. McLellan, Rino Rappuoli

doi: <https://doi.org/10.1101/2020.12.28.424451>

This article is a preprint and has not been certified by peer review [what does this mean?].



# Worldwide Collaboration & Sharing

This article is made available via the [ACS COVID-19 subset](#) for unrestricted RESEARCH re-use and analyses in any form or by any means with acknowledgement of the original source. These permissions are granted for the duration of the World Health Organization (WHO) declaration of COVID-19 as a global pandemic.

**JCIM** JOURNAL OF CHEMICAL INFORMATION AND MODELING

[pubs.acs.org/jcim](https://pubs.acs.org/jcim) Viewpoint

## A Community Letter Regarding Sharing Biomolecular Simulation Data for COVID-19

Rommie E. Amaro\* and Adrian J. Mulholland\*

Cite This: <https://dx.doi.org/10.1021/acs.jcim.0c00319> Read Online

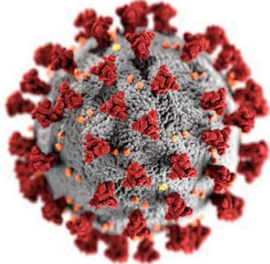
**ACCESS** | [Metrics & More](#) | [Article Recommendations](#)

Molecular simulation and modeling can contribute to combating the current COVID-19 global pandemic, e.g. [rithm Store](#),<sup>2</sup> [the Open Science Framework](#),<sup>3</sup> and [the European Open Science Cloud](#).<sup>4</sup>

Biography ▾ Viral/Host Structural Data ▾ Therapeutics ▾ Tools Contribution ▾ About ▾

## COVID-19 Molecular Structure and Therapeutics Hub

Aggregating critical information to accelerate drug discovery for the molecular modeling and simulation community.



*Please contribute to curation and data at this site!*

<http://covid.molssi.org>

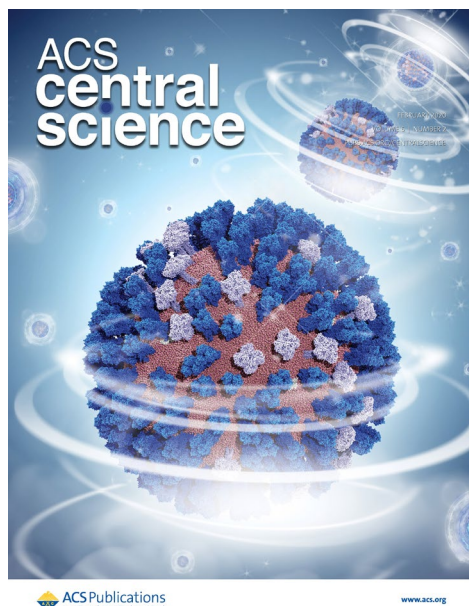
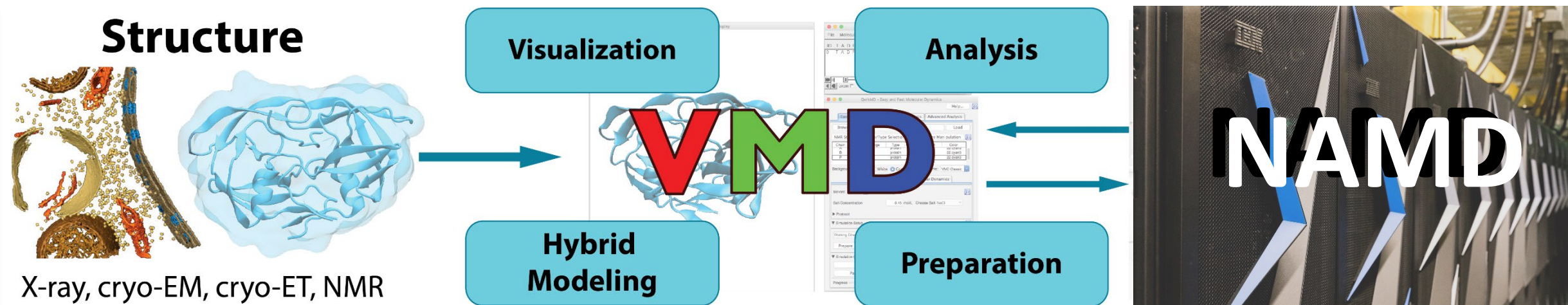
> 200 groups signed on!

Frontera datasets shared > 4k times

Open science (for COVID19) embraced by community, March 2020



# NAMD+VMD Molecular Modeling Tools



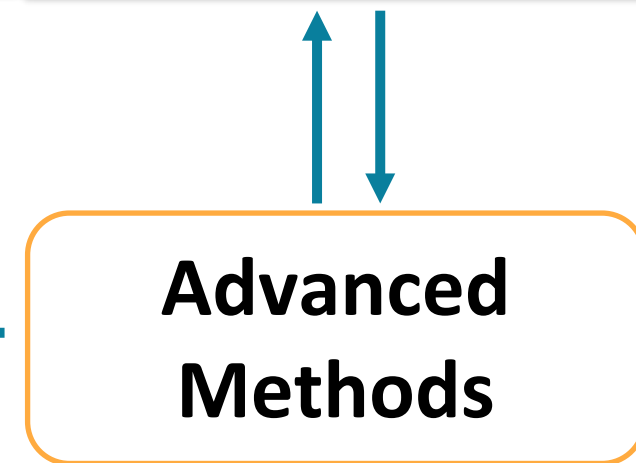
Weighted Ensembles

AI Driven MD

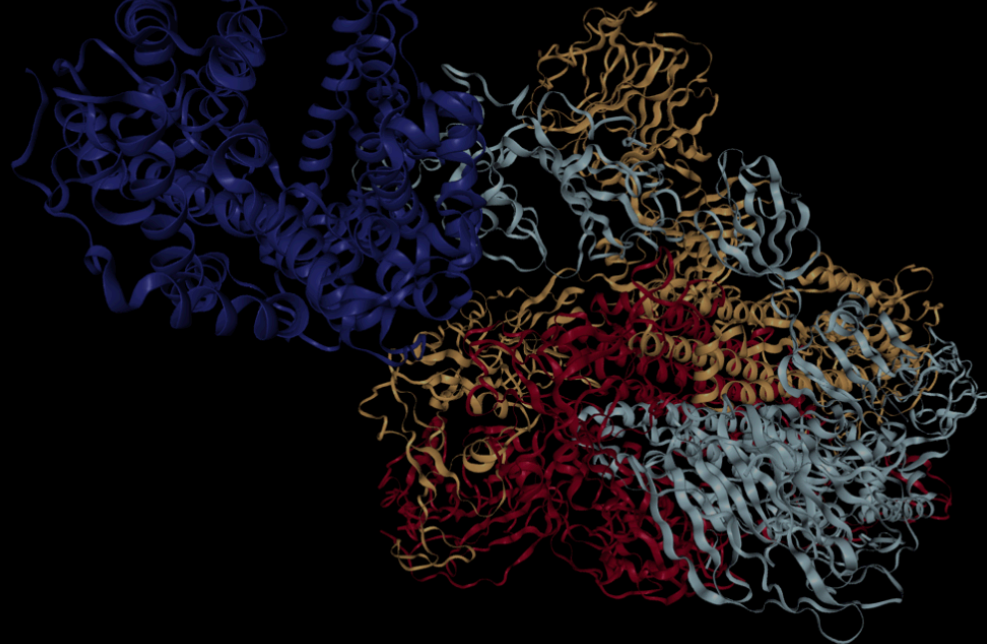
Collective Variables

...

Importance of community software, open access



# The COVID-19 High Performance Computing Consortium



Bringing together the Federal government, industry, and academic leaders to provide access to the world's most powerful high-performance computing resources in support of COVID-19 research.

43

—  
Consortium  
members

50k

—  
GPUs

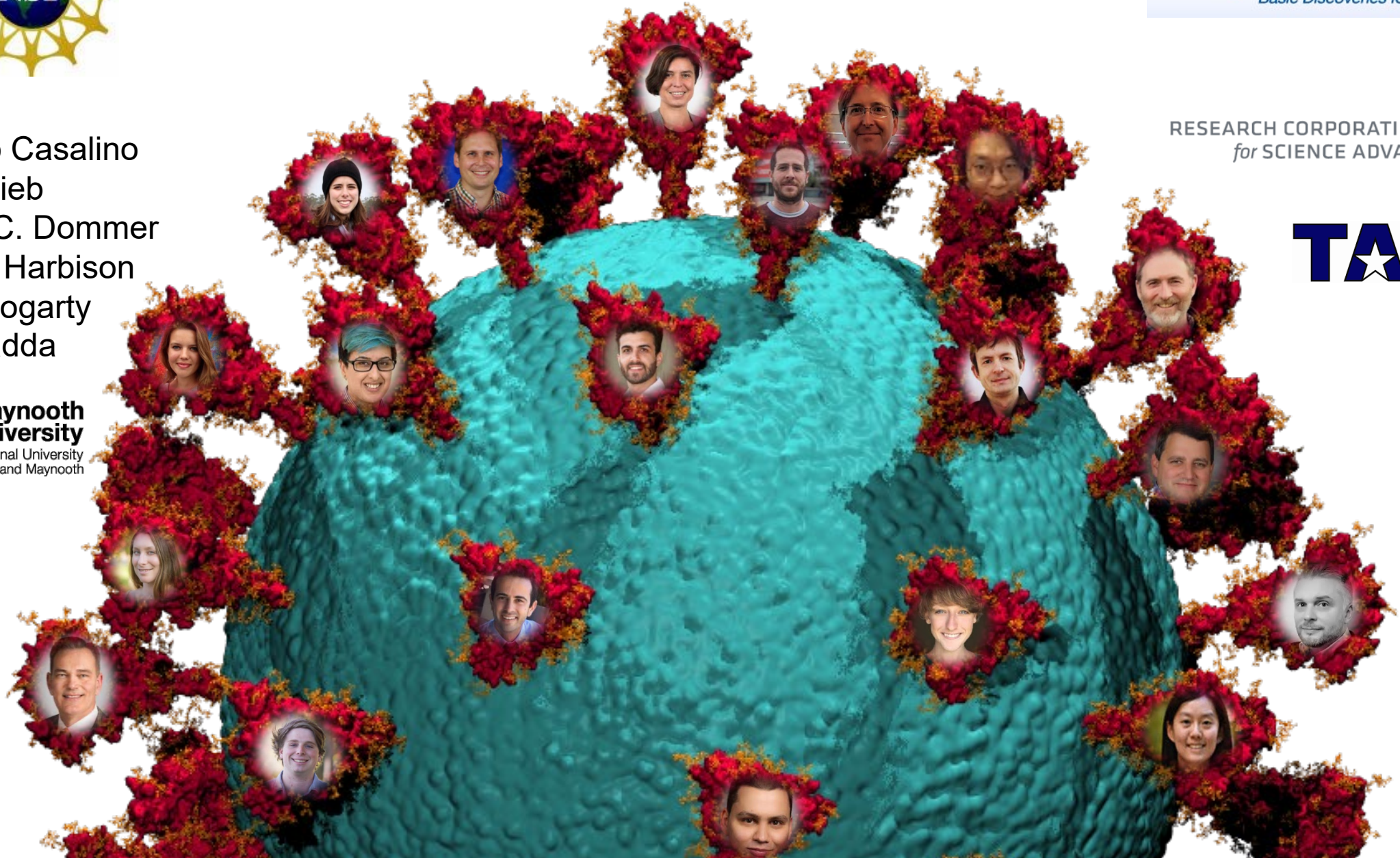
Making compute cycles rapidly available



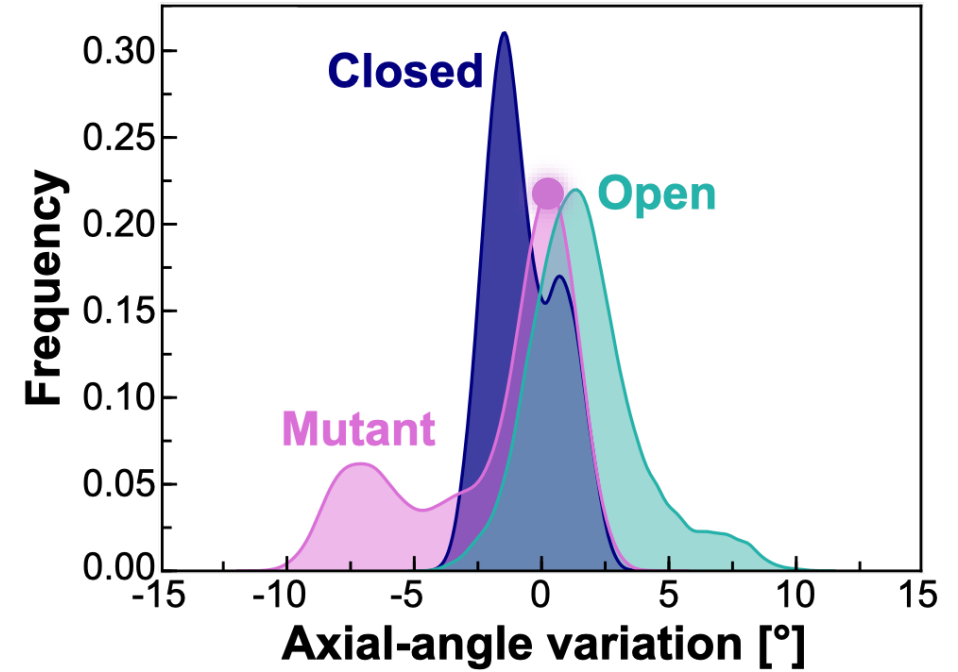
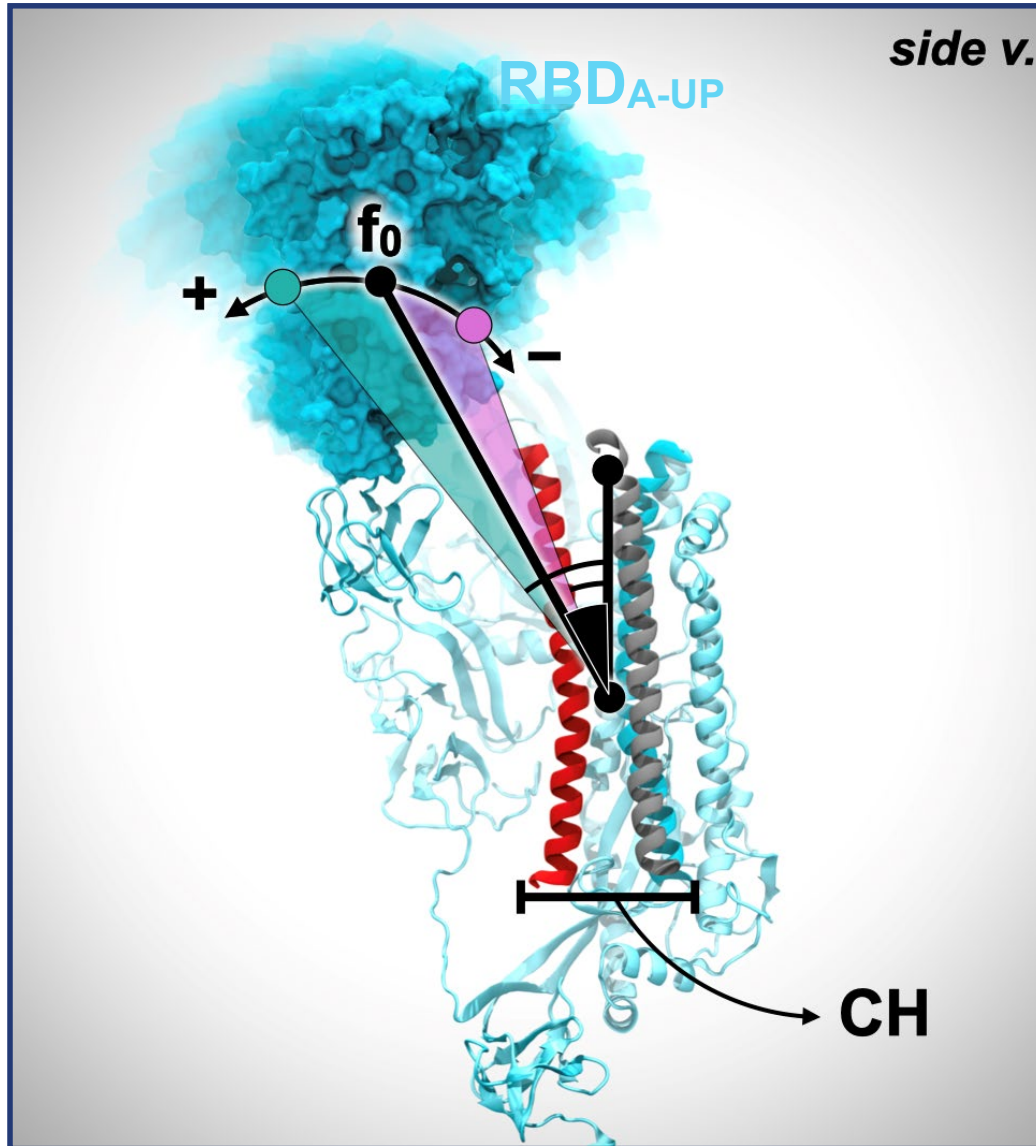
# Acknowledgements



Lorenzo Casalino  
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Carl A Fogarty  
Elisa Fadda

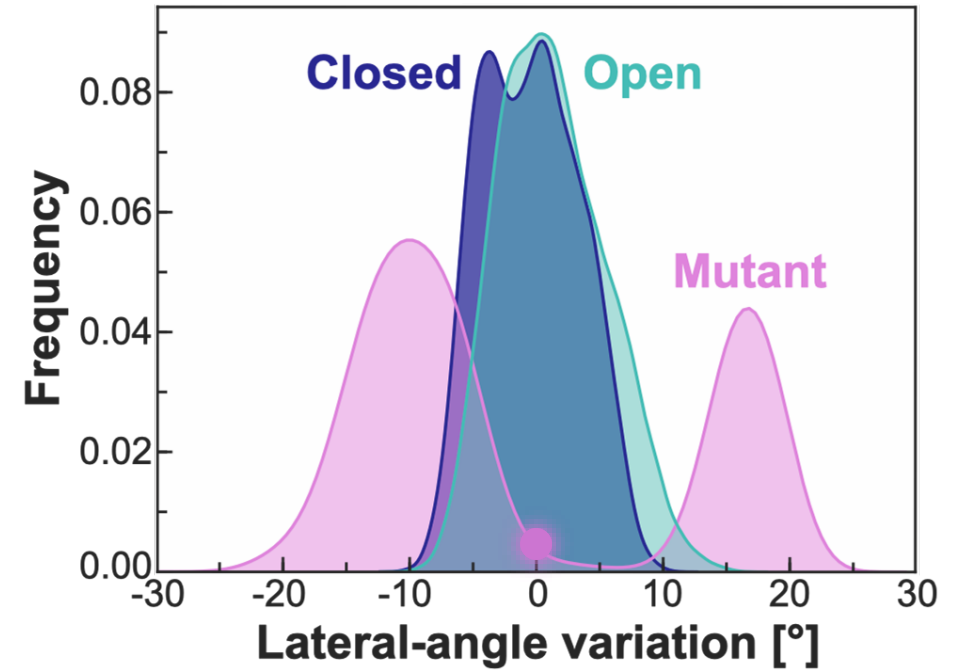
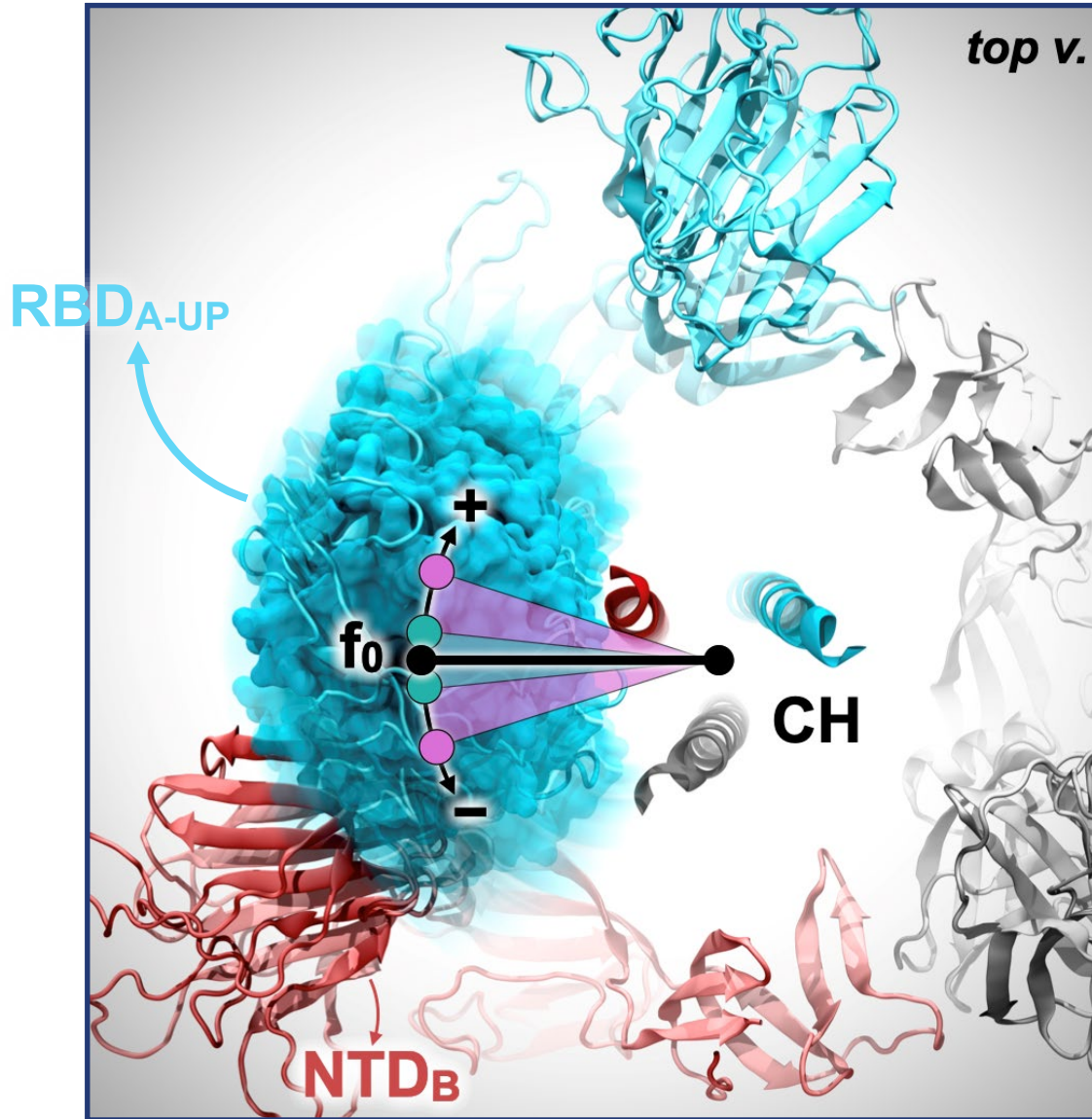


# RBD axial tilting



- RBD “down” of CLOSED wild type shows no variation
- RBD “up” of OPEN wild type is overall stable, with a slightly “opening” trend
- RBD “up” of MUTANT exhibits a “closing” trend, showing a negative shoulder

# RBD lateral rotation



- RBD “down” of CLOSED wild type shows no variation
- RBD “up” of OPEN wild type is stable
- RBD “up” of MUTANT exhibits large instability, with a bimodal distribution

# Our simulation models shared with and vetted by groups worldwide



.... before publication. Many thanks to those who found nits to fix!