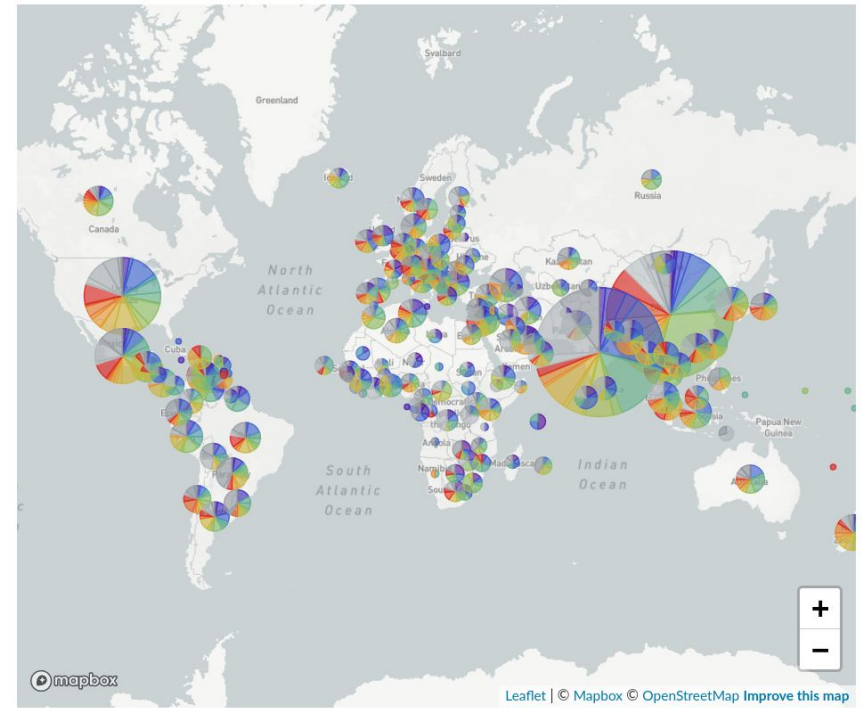
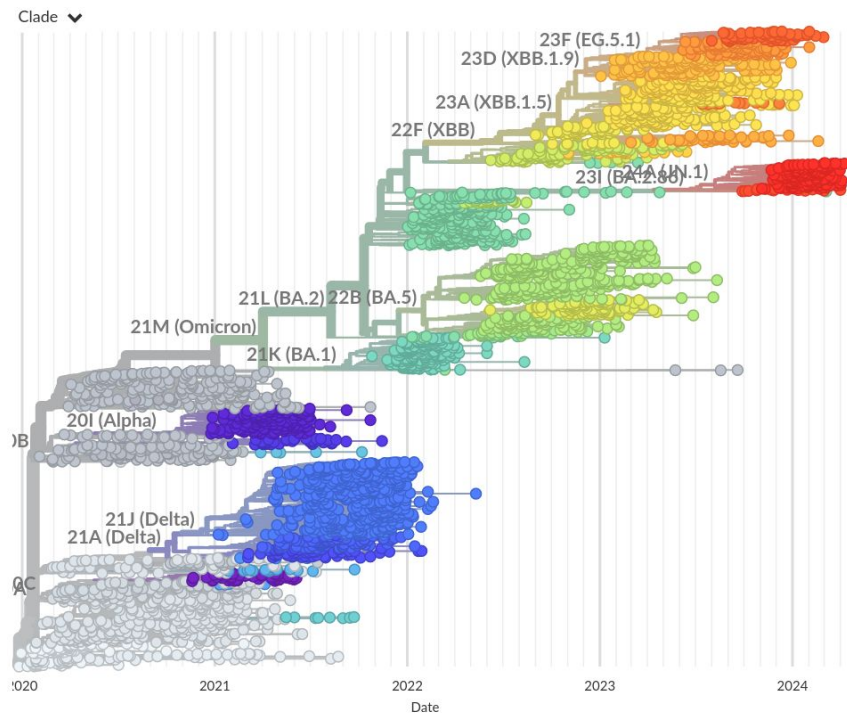
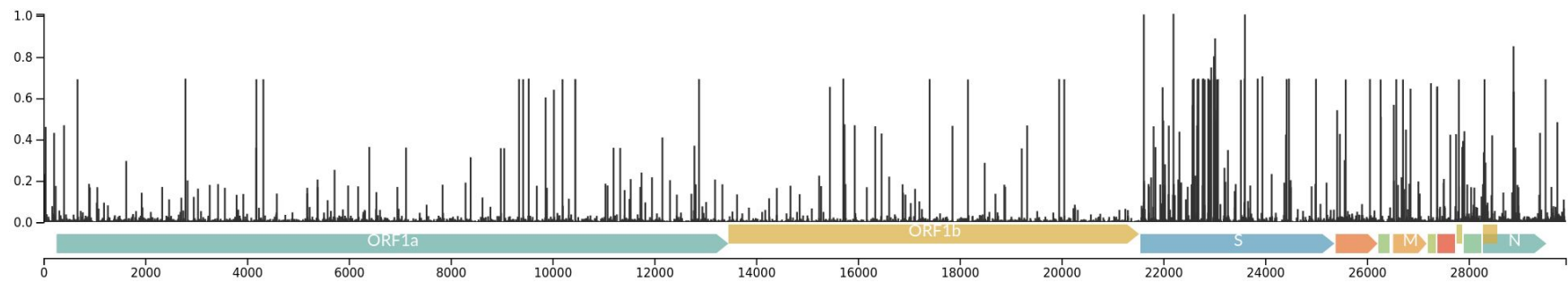


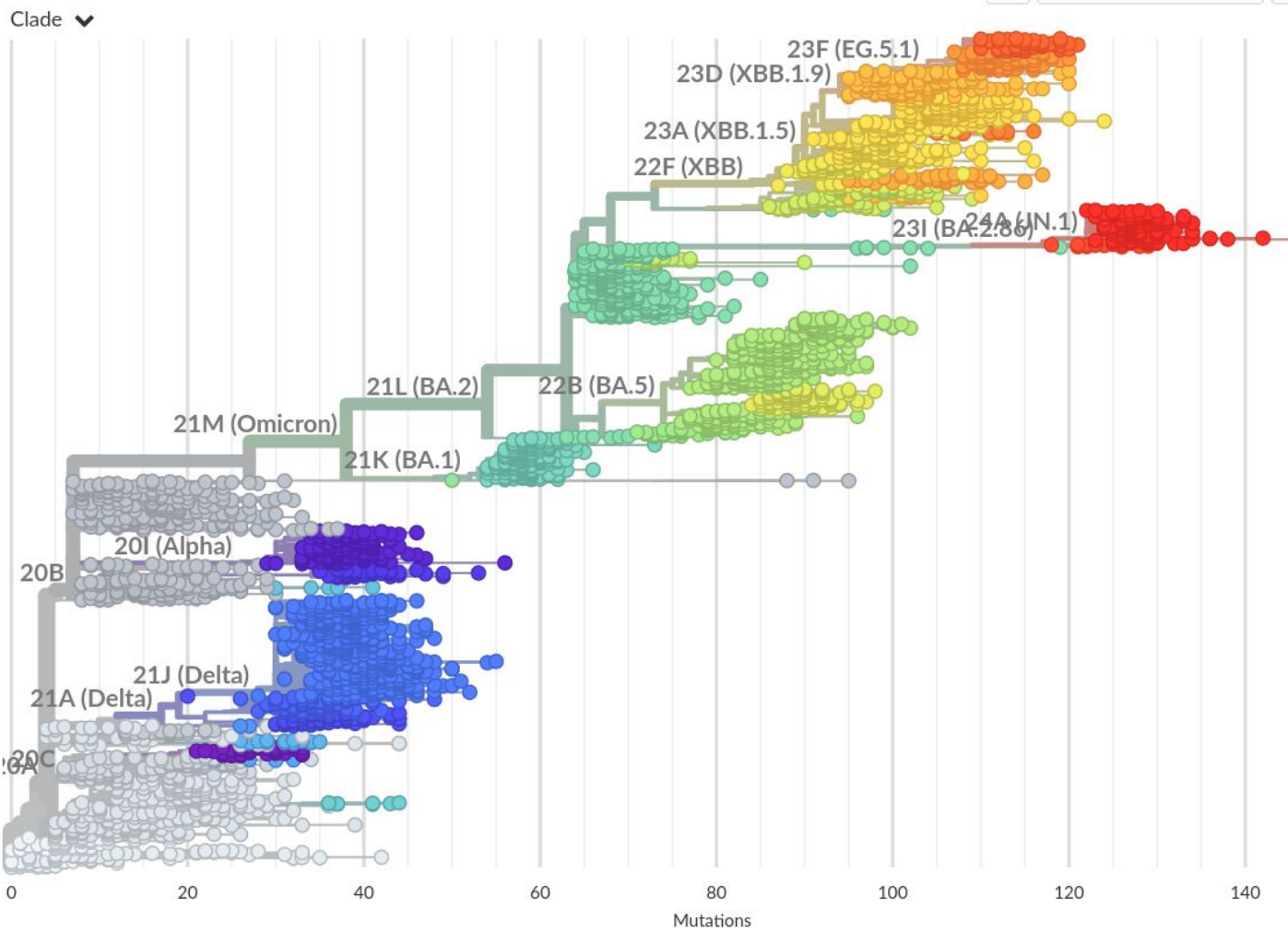
## **Evolution of SARS-CoV-2, immune escape, and the emergence variants of concern**

Richard Neher, University of Basel

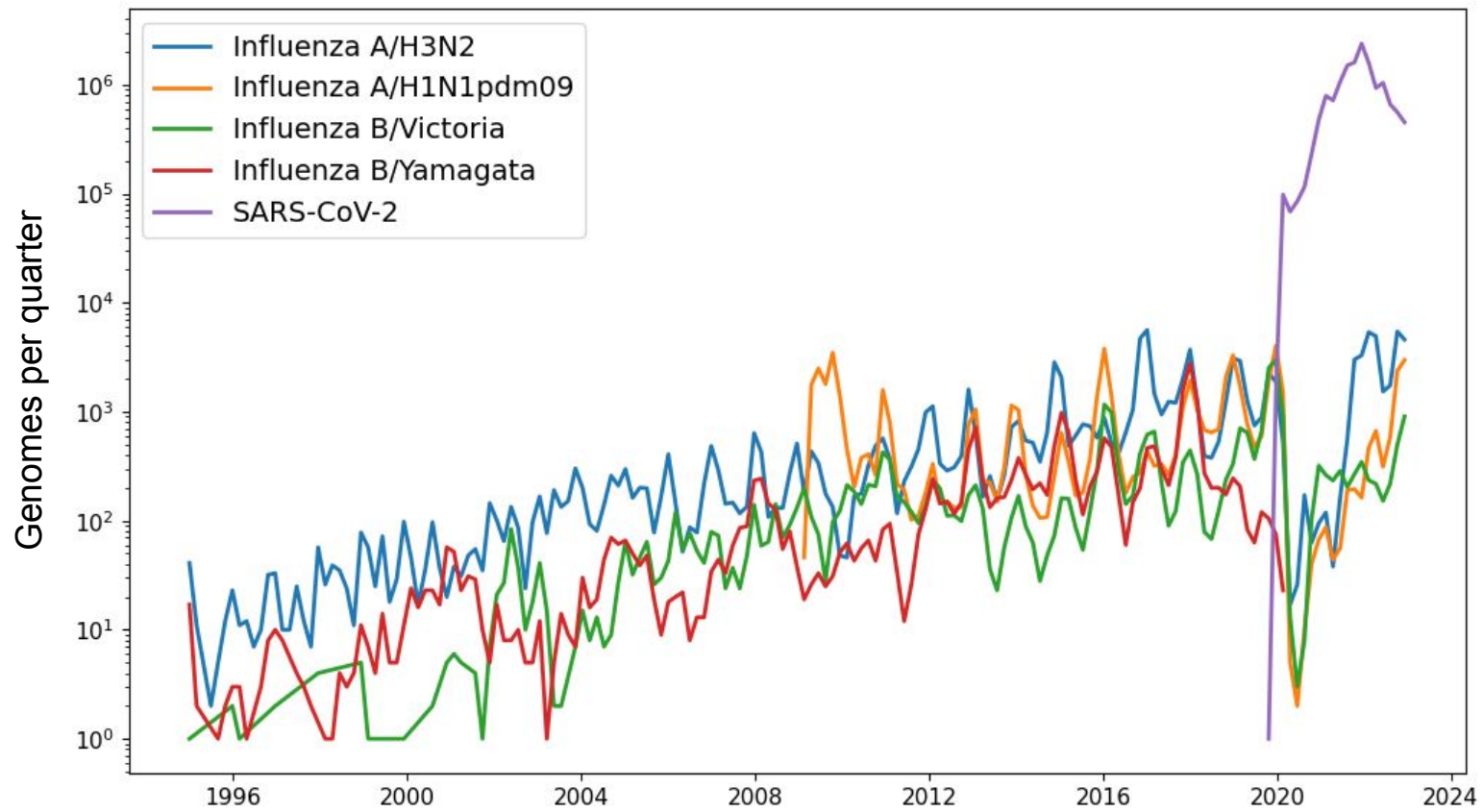


### Nucleotide diversity of genome





## Millions of publicly available viral genomes



**What can we learn from so much data?**

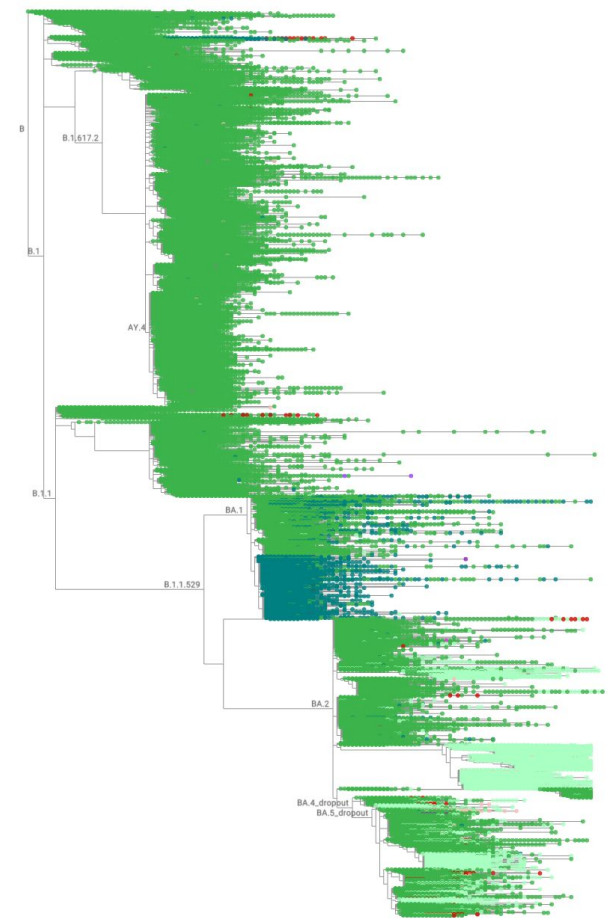
## Pandemic scale trees – UShER and Taxonium

- Now >16M SARS-CoV-2 sequences
- Pre-pandemic tools can't deal with such volumes
- New tools: UShER, CoV-spectrum, Taxonium

→ Using UShER (by UCSC), Angie Hinrichs has continuously updated a tree of most available data

### Rough estimate:

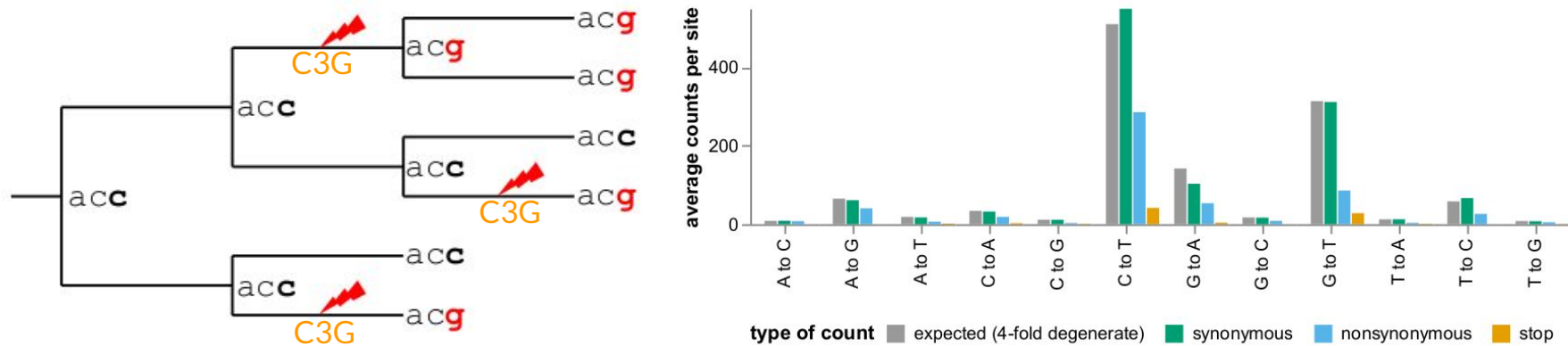
- Each leaf contributes 1 month of evolution  
→ more than 1M years of evolution
- Every position mutated 100s of times somewhere on the tree.  
→ should allow inference of position specific properties



Taxonium by Theo Sanderson

## Mutation spectra are dominated by C->T and G->T mutations

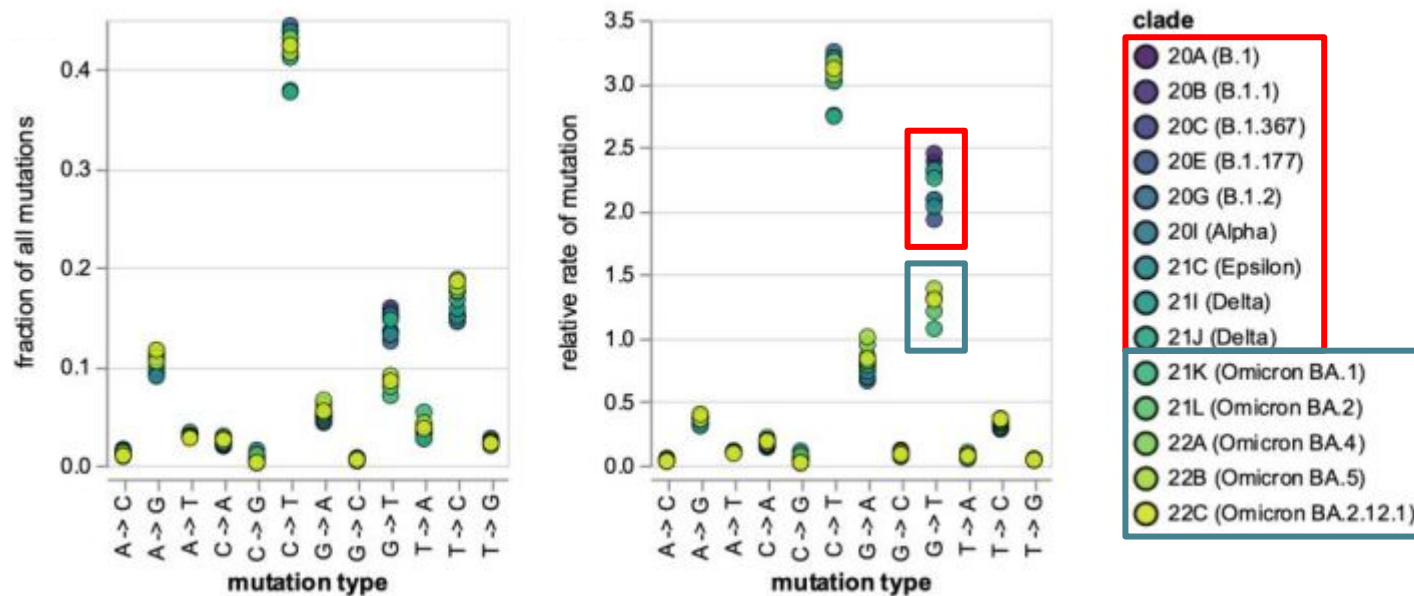
UShER tree is annotated with mutations:



- Expected patterns of purifying selection (more later)
- Fixed or high frequency mutations behave differently (more later)

Bloom and Neher, 2023

## Mutation spectra differ between pre-Omicron and Omicron variants

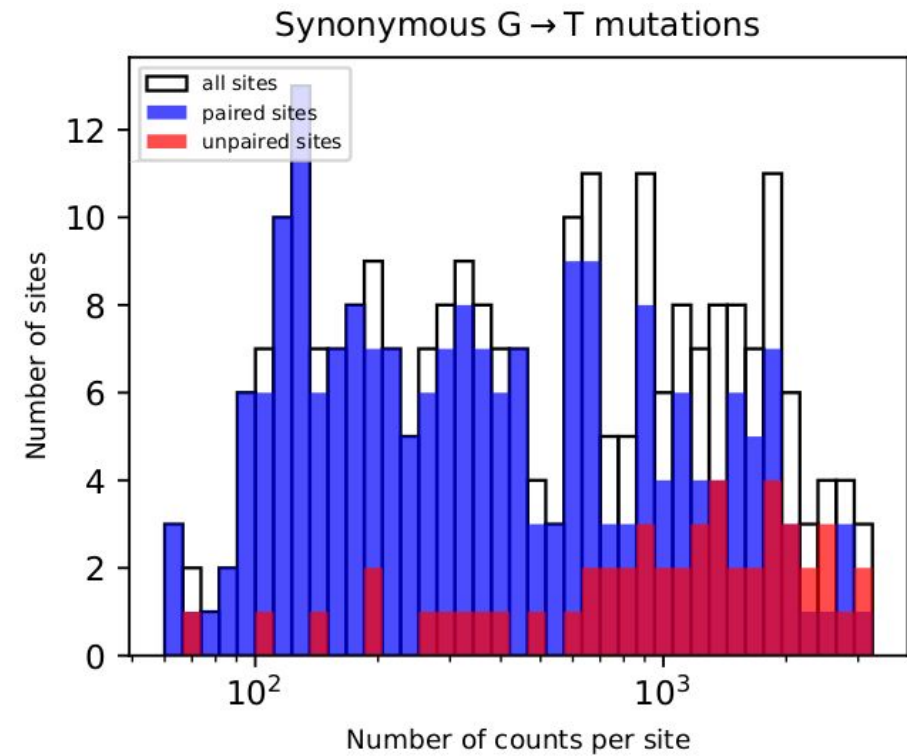
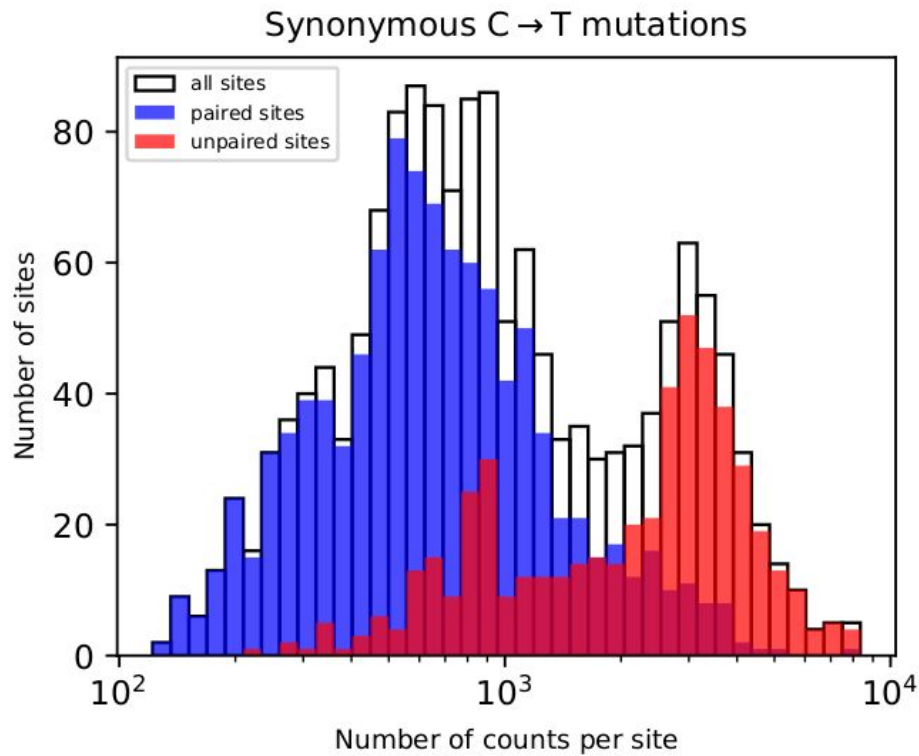


- C->T and G->T mutations are likely driven by processes that vary with the degree of immune activation
- C->T mutations depend strongly on secondary structure (Hensel, 2024)
- See also Lamb et al, 2024, Ruis et al, 2022

Bloom et al, 2023



## Mutation rates vary from site to site and depend on context



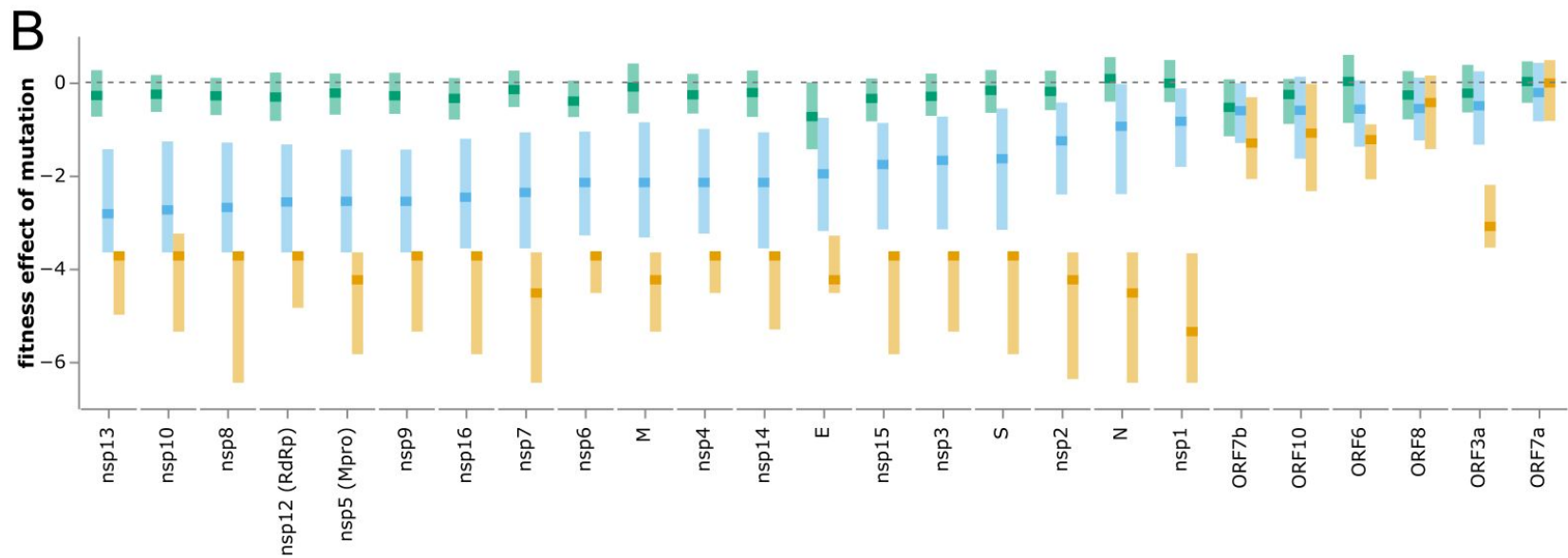
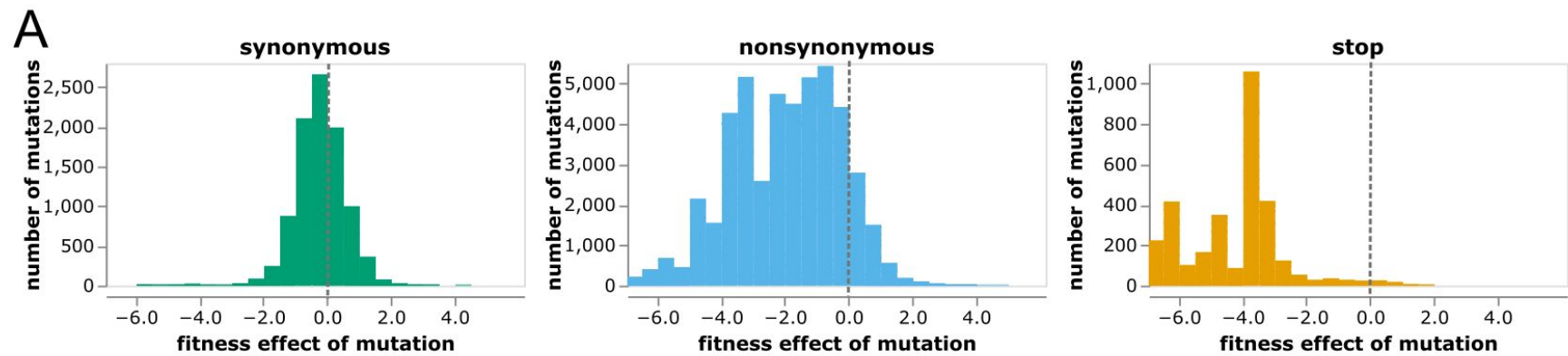
## Site specific fitness effect estimates across most of the SARS-CoV-2 genome

1. Use four-fold synonymous sites as proxy for expected counts for each mutation (we are in the process of modeling expected counts more carefully)
2. Compare observed counts to expected counts.
3. Aggregate mutations for each amino acid substitution
4. Compute fitness proxy as

$$\log(n_{obs}/n_{exp})$$

5. Branching process models: deleterious mutations with selection coefficient  $s$  (epsilon is the sampling rate)

$$\log(1 + s/\epsilon) = \log(n_{obs}/n_{exp})$$

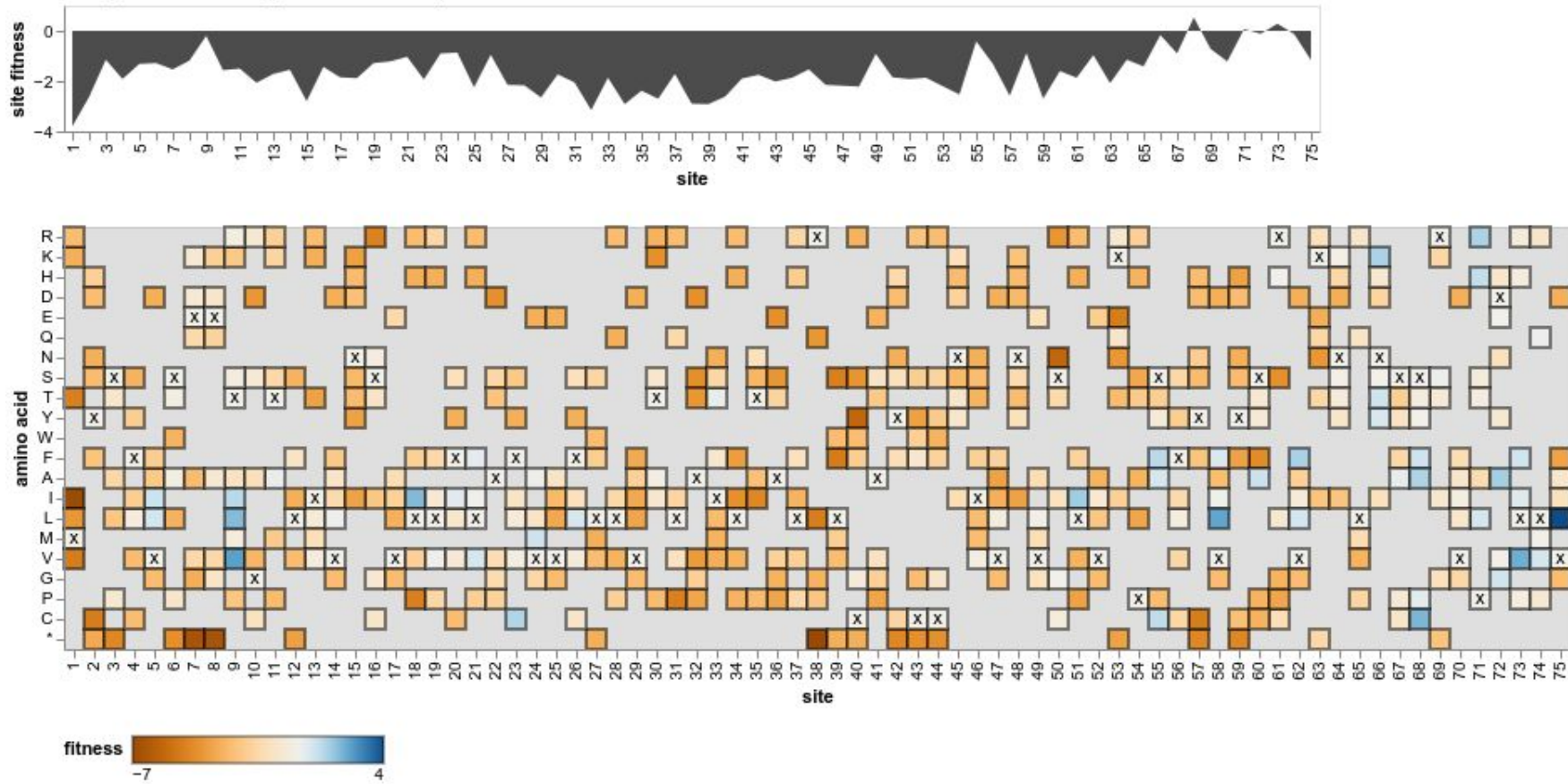


Bloom and Neher, 2023

Interactive plots at

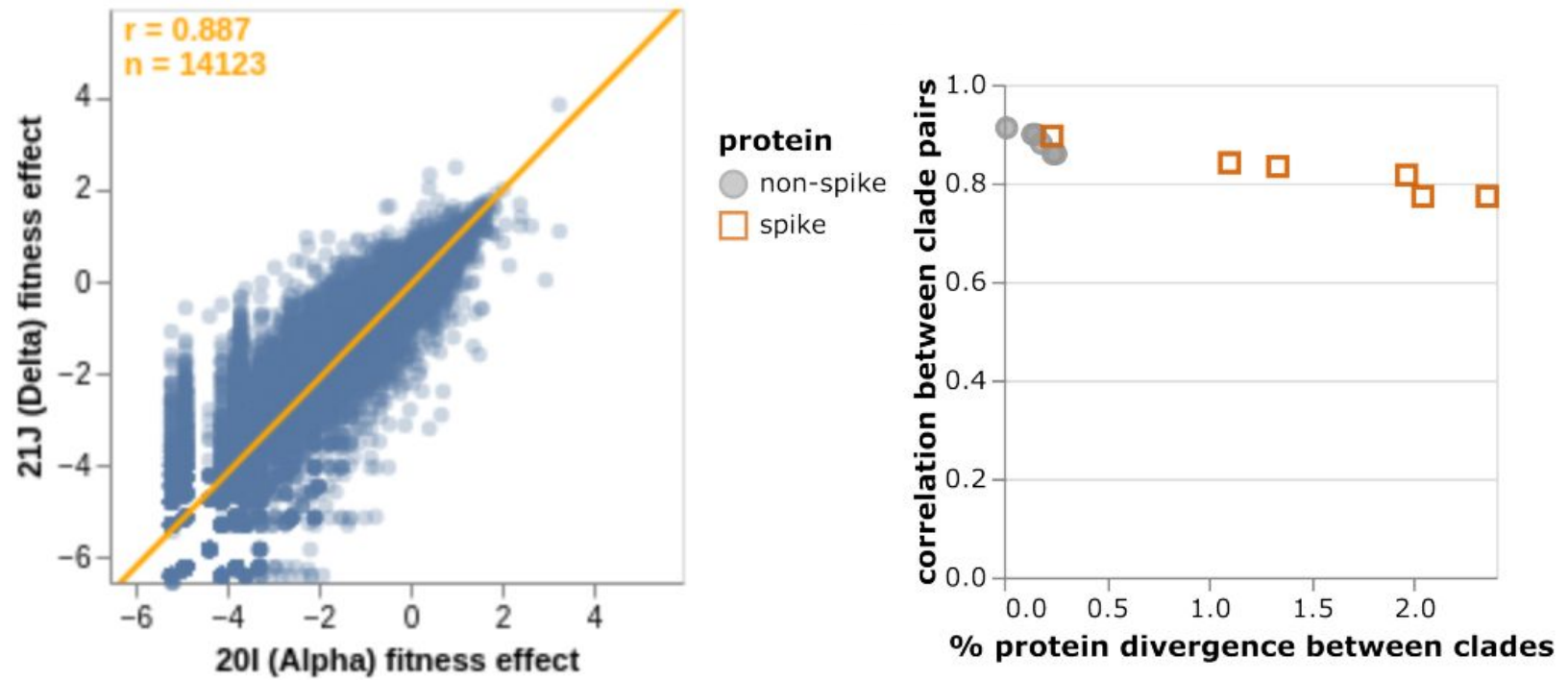
[jbloomlab.github.io/SARS2-mut-fitness/](https://jbloomlab.github.io/SARS2-mut-fitness/)

# Fitness costs of mutations in the E protein



Bloom and Neher, 2023

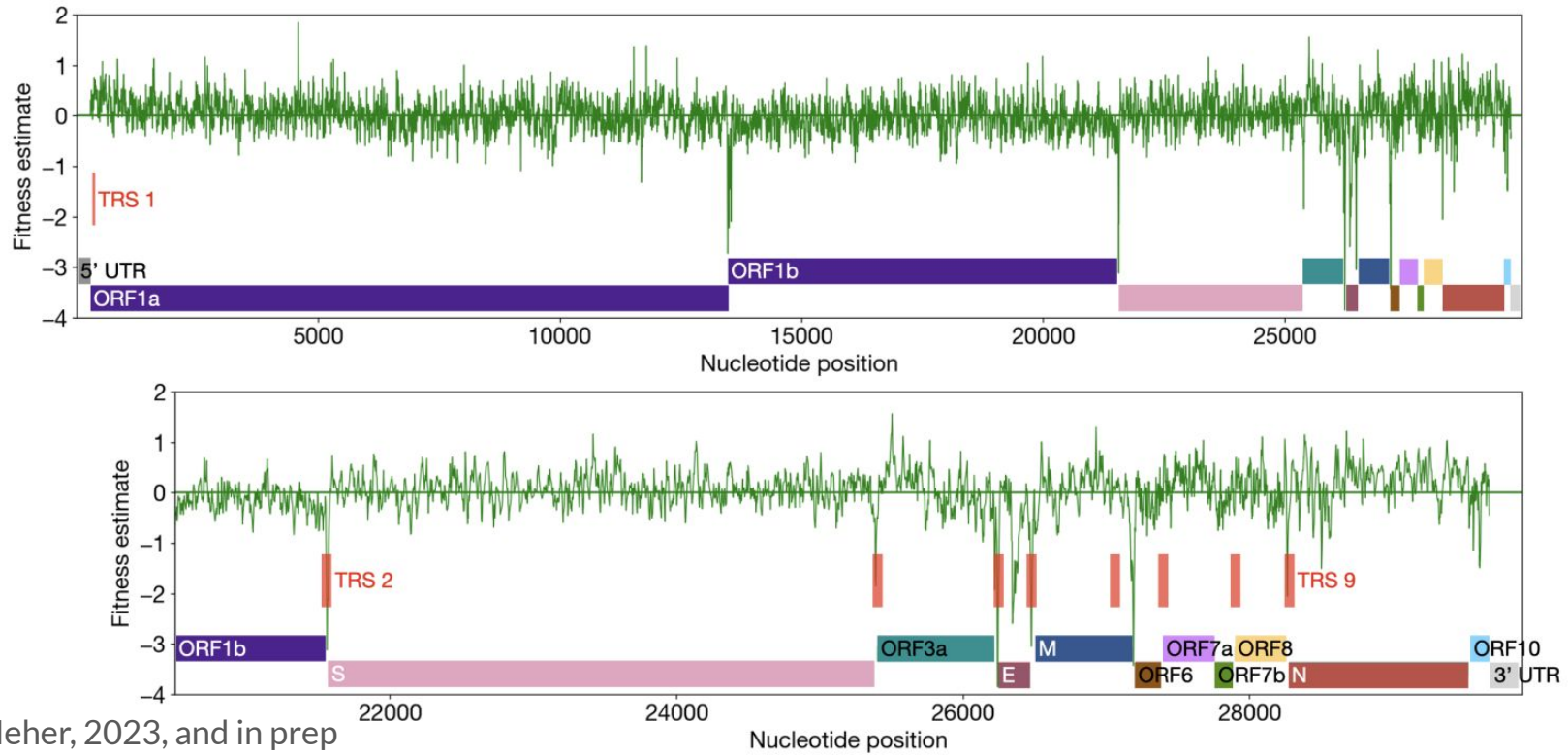
## Concordance decreases with divergence – epistasis



Bloom and Neher, 2023

## Selection beyond the coding sequence

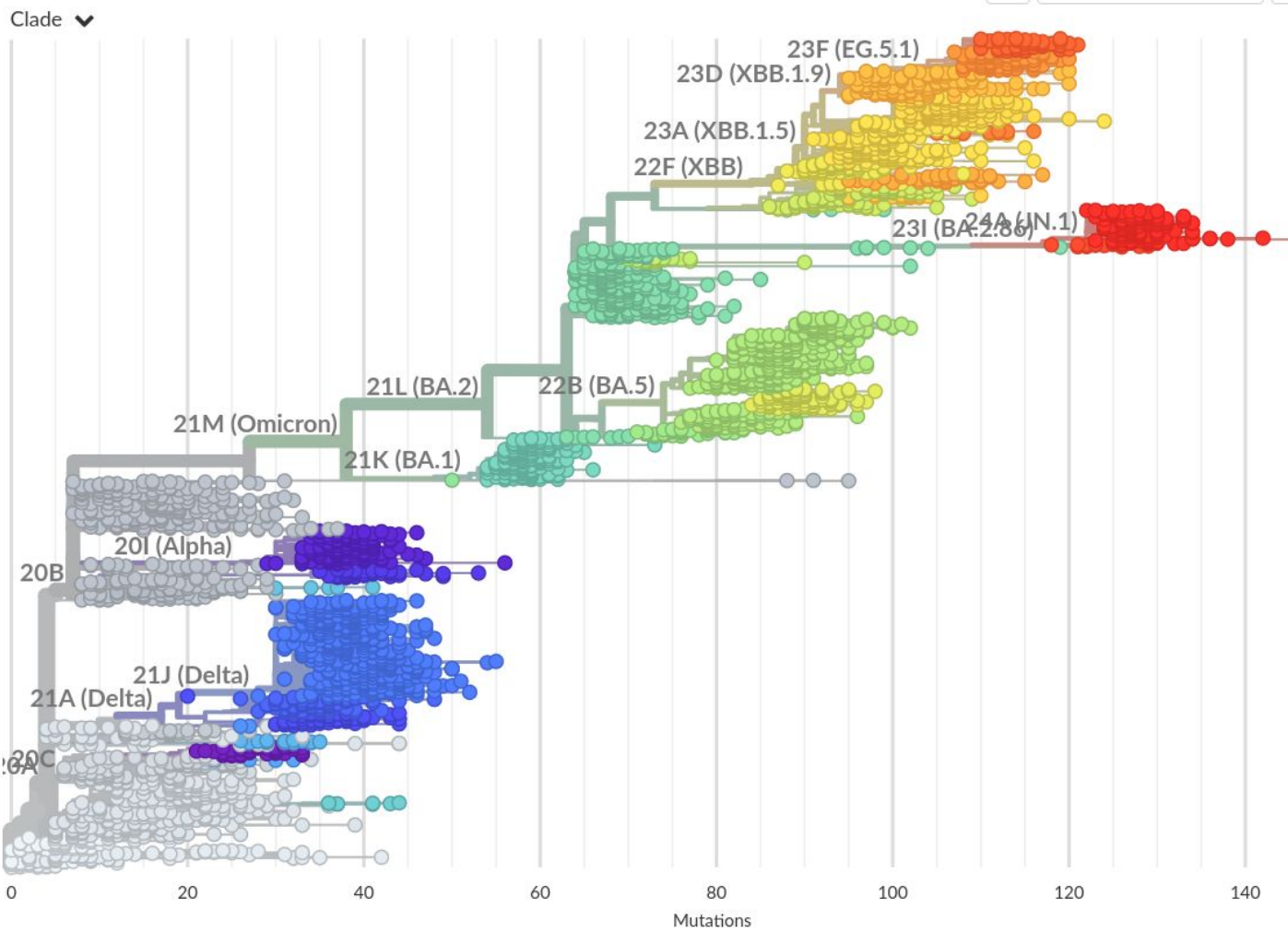
- In coding regions, constraints on nucleotide sequence can only be seen at synonymous sites
- But there are sufficiently many to detect conserved regions  
→ only a minority of the genome is strongly constrained

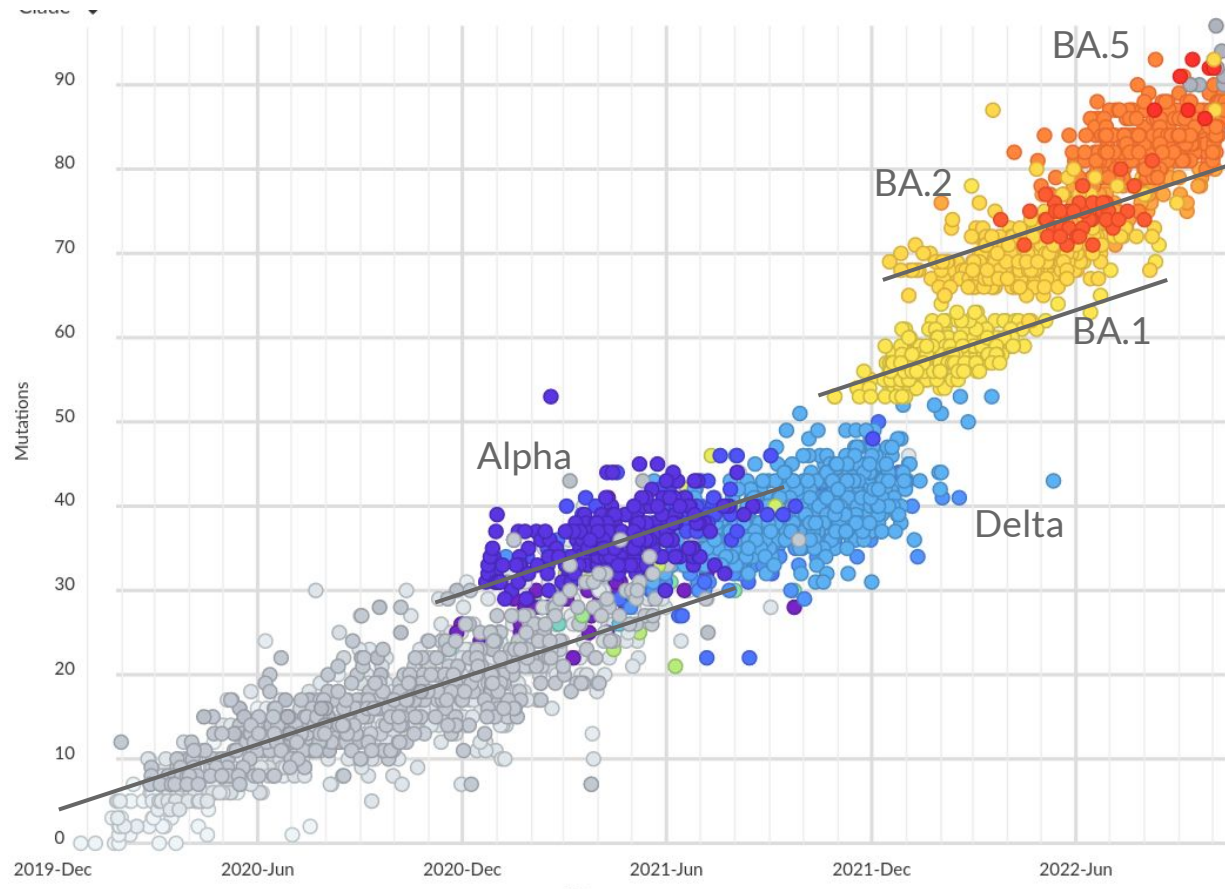


Bloom and Neher, 2023, and in prep

**From mutations and purifying selection to divergence...**



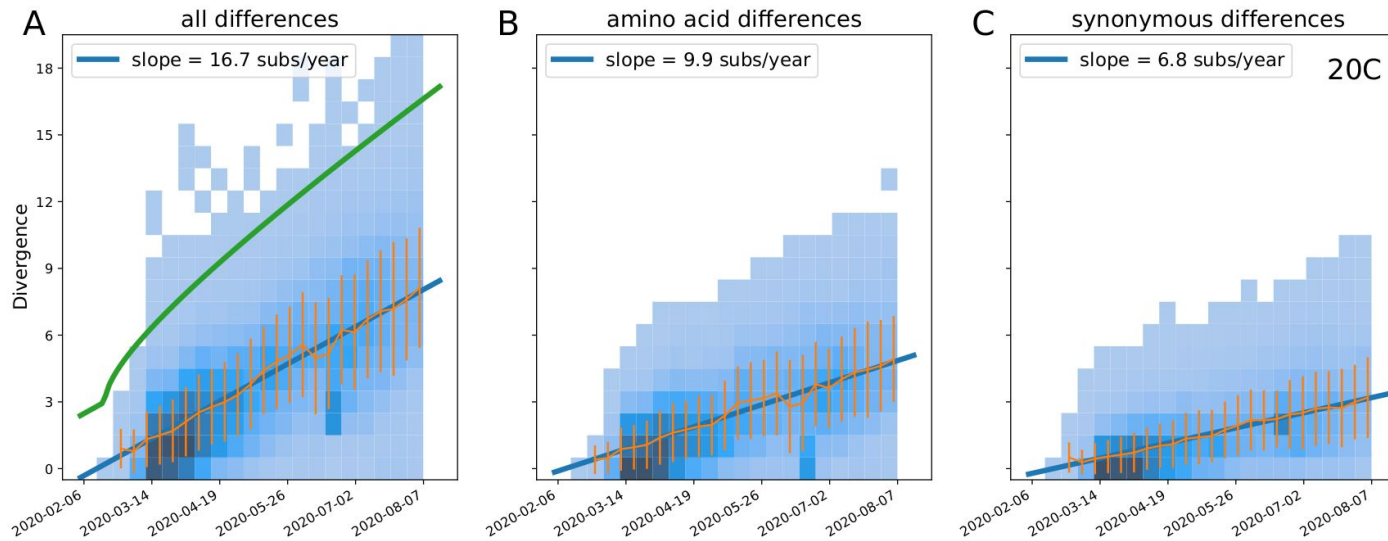




- Rapid evolution (~30 changes per year)  
Coronaviruses were traditionally thought of as rather stable.
- Stepwise dynamics:
  - Slow within variants
  - Rapid jumps in between
- Rapid jumps possibly due to chronic infections; many hallmarks of adaptation

See also Duchene et al, Hill et al.

## Robust determination of within-Clade evolutionary rates



- Use sequences that have all lineage defining mutations (removes problematic sequences)
- Linear regression on the number of **additional** synonymous or amino acid mutations (shared ancestry is a minor problem since most clades have approximately star like phylogenies)
- Straightforward to do for different proteins, regions etc.

→ Amino-acid and synonymous rate estimates for each clade

Neher, 2022

## Amino acid rates within clades declined with time

### Within vs Backbone rates:

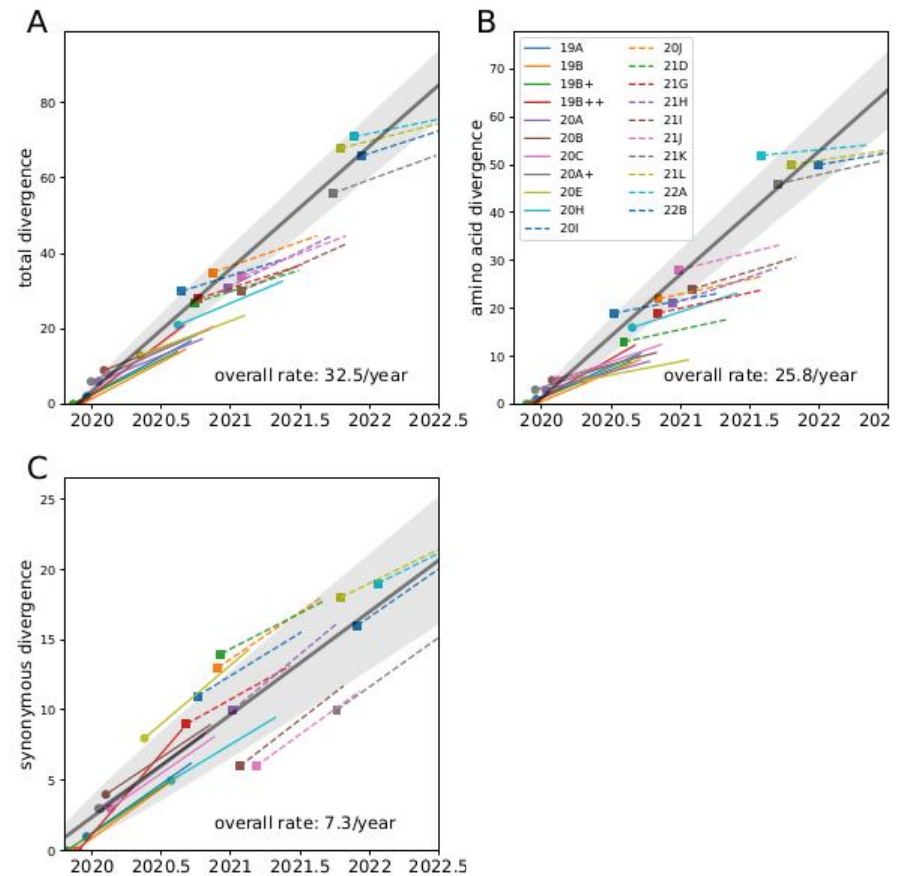
- All clades compatible with a common backbone rate
- Within clade rates are systematically lower

### Synonymous rate:

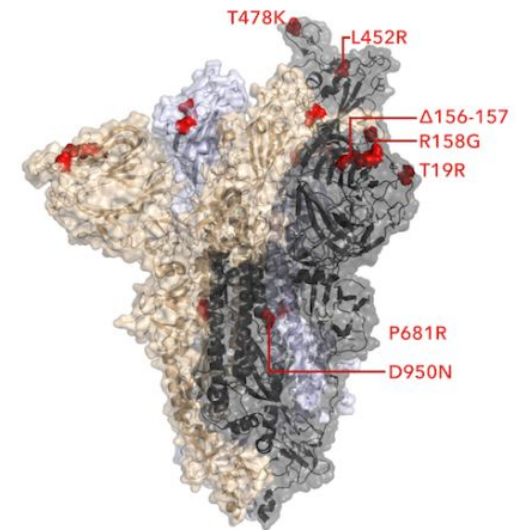
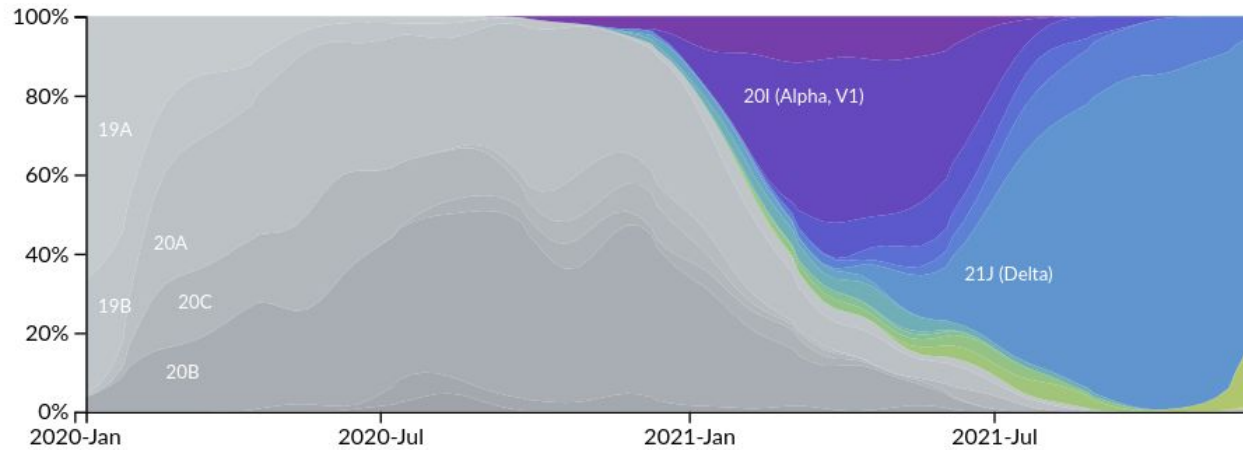
- All variants roughly 6 changes per year
- Very little variation
- Overall rates similar, around 7 changes/year

### Amino acid rate:

- The overall rate from clade to clade is much higher than the within clade rate

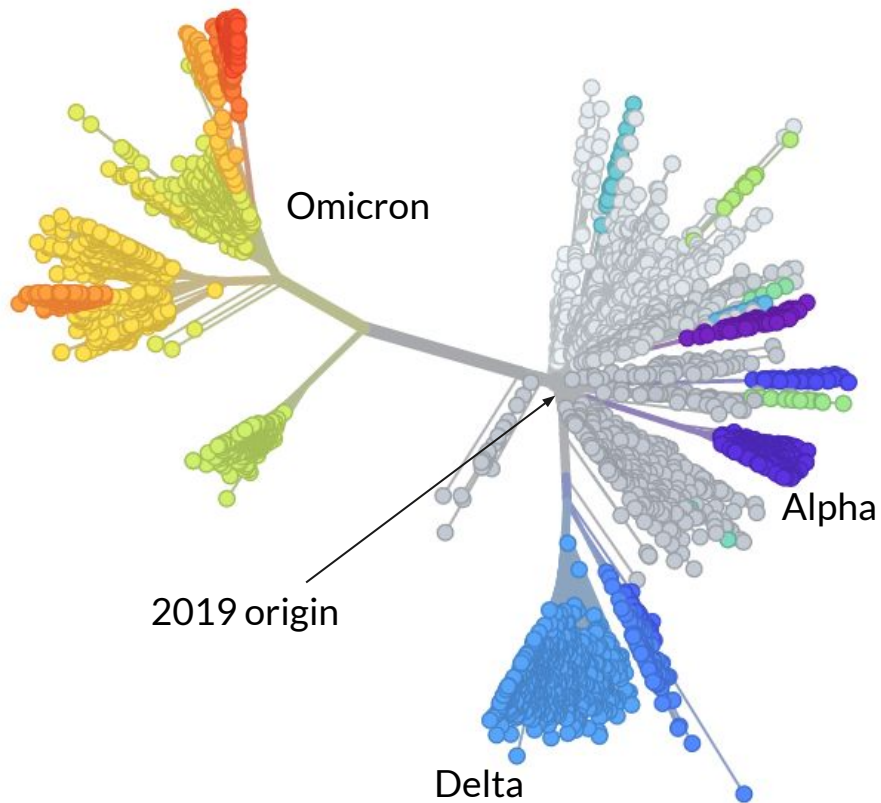


## 2021: Delta – global dominance

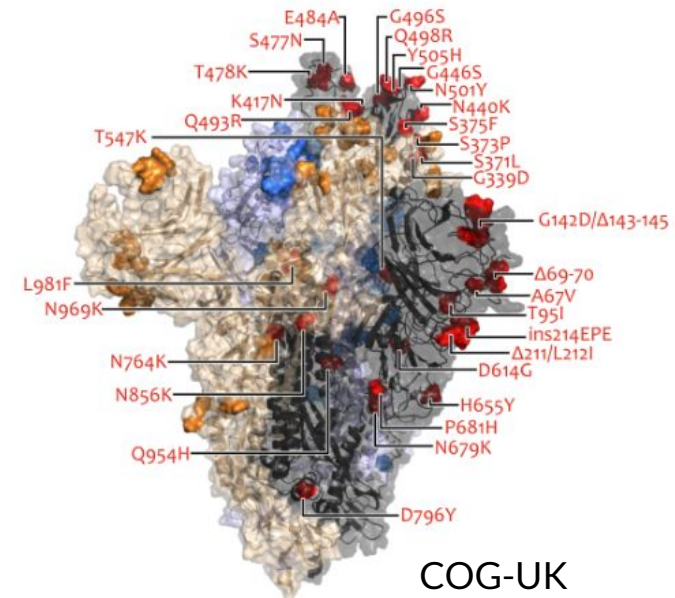


- Several mutations that increase transmissibility
- Increased severity of disease
- Moderately reduce immune recognition (less than Beta)

## November 2021: Omicron



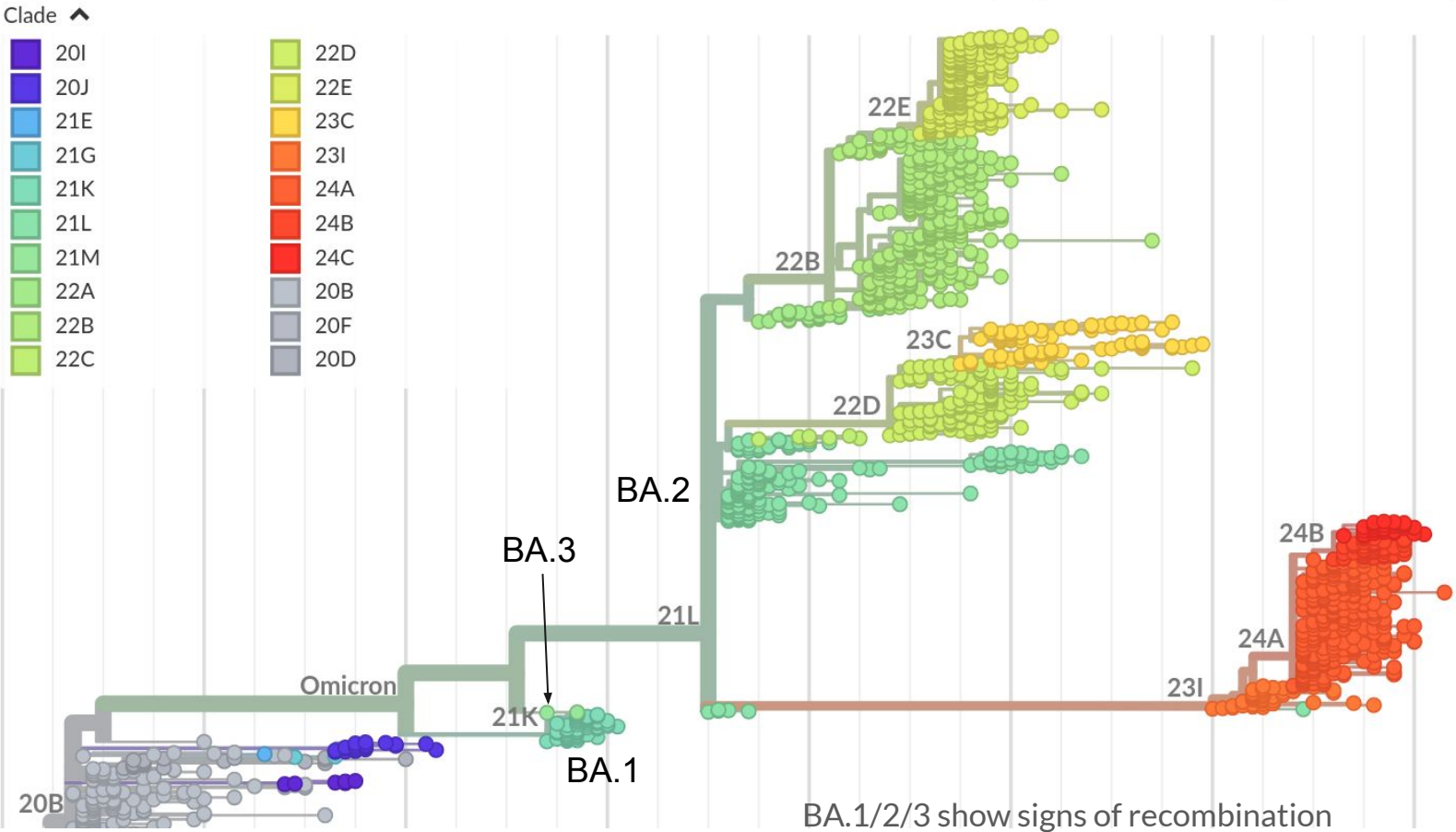
- Heavily mutated sister variant of previous VOCs
- Several distinct variants
- High rate of reinfections
- Very rapid spread



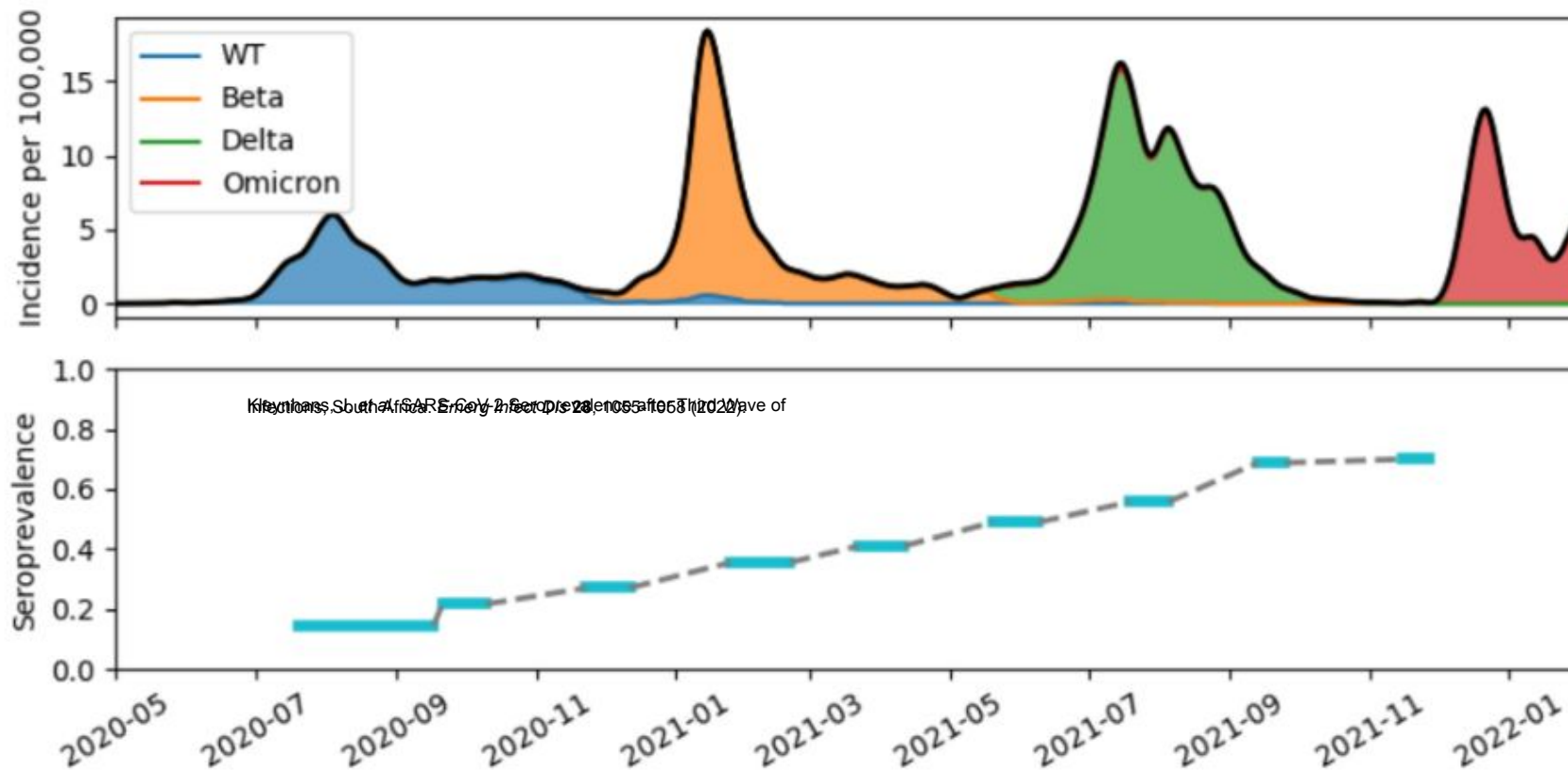
→ Michael Desai's talk later this week!!



# Early Omicron diversity



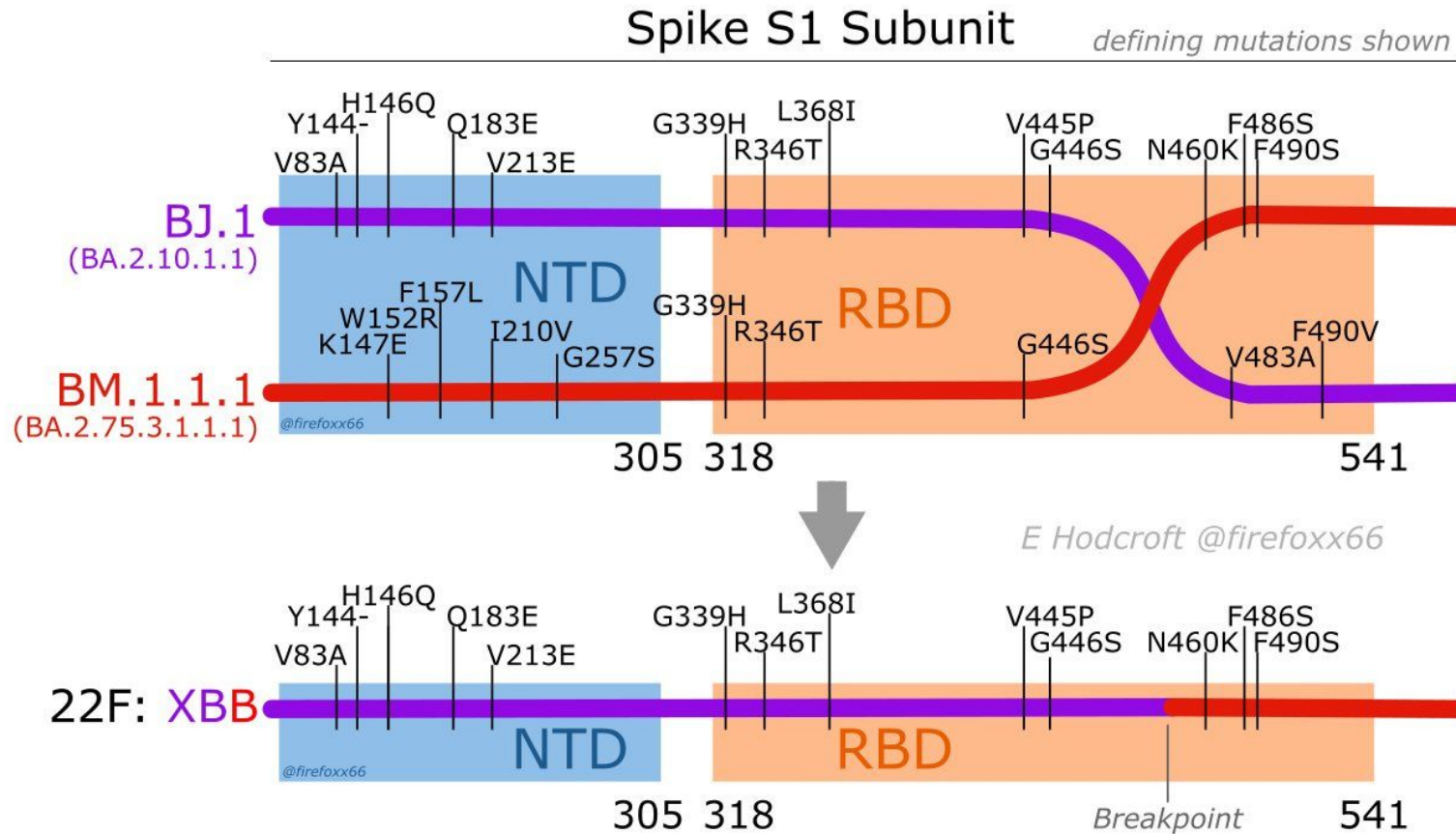
## Seroprevalence in South-Africa



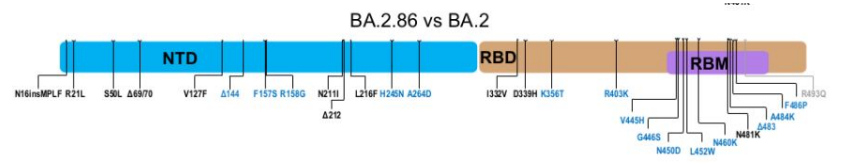
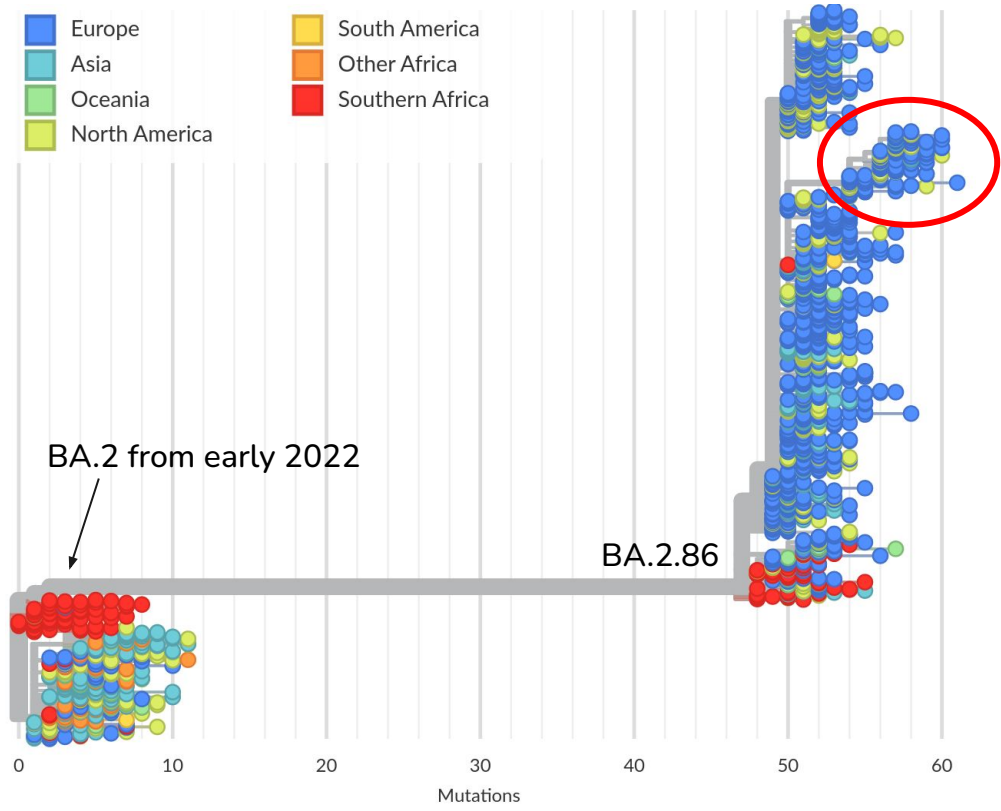
→ by end of 2021, most people were infected or vaccinated (outside of some parts of East-Asia)



XBB is likely a recombinant between two BA.2 descendents



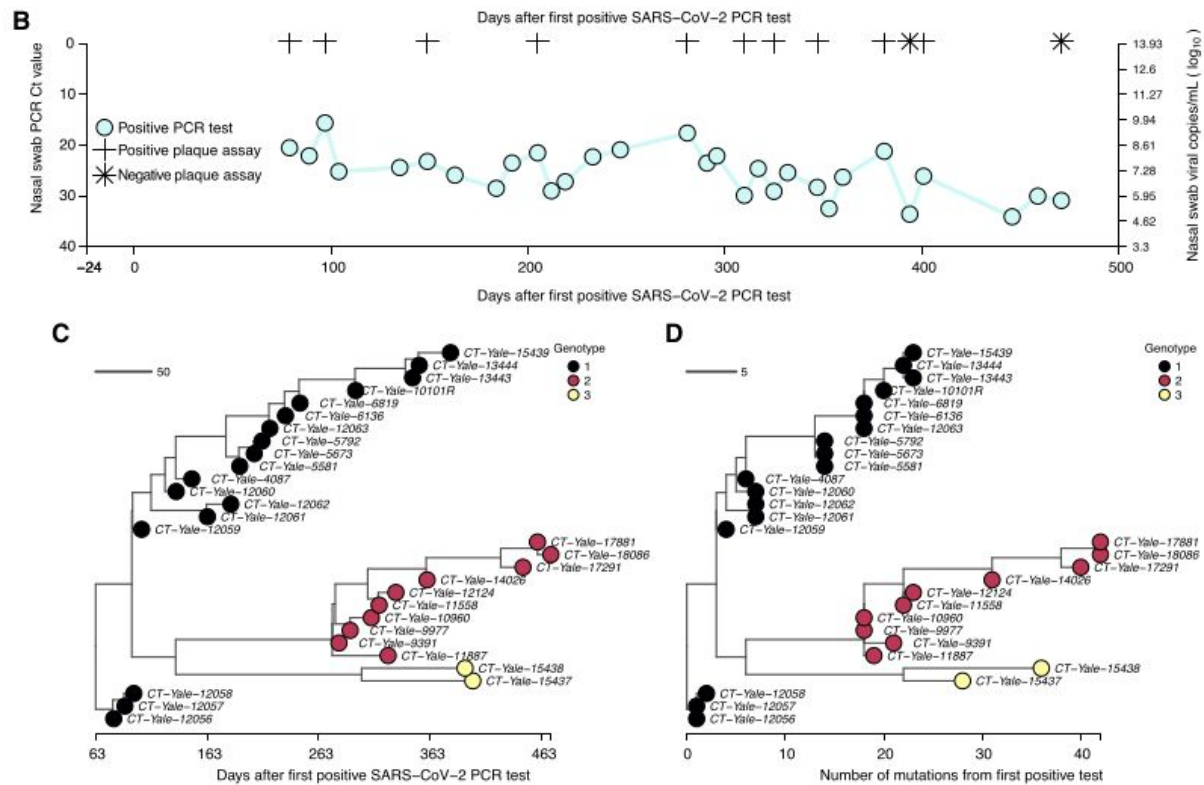
# Latest successful highly divergent variant: BA.2.86



- Chronic infections are common in people living with unsuppressed HIV
- Rapid humoral immune escape of SARS-CoV-2 in many such individuals
- Emerged in April 2023, initially slow growth
- Sub-variant JN.1 rapidly took over in late 2023

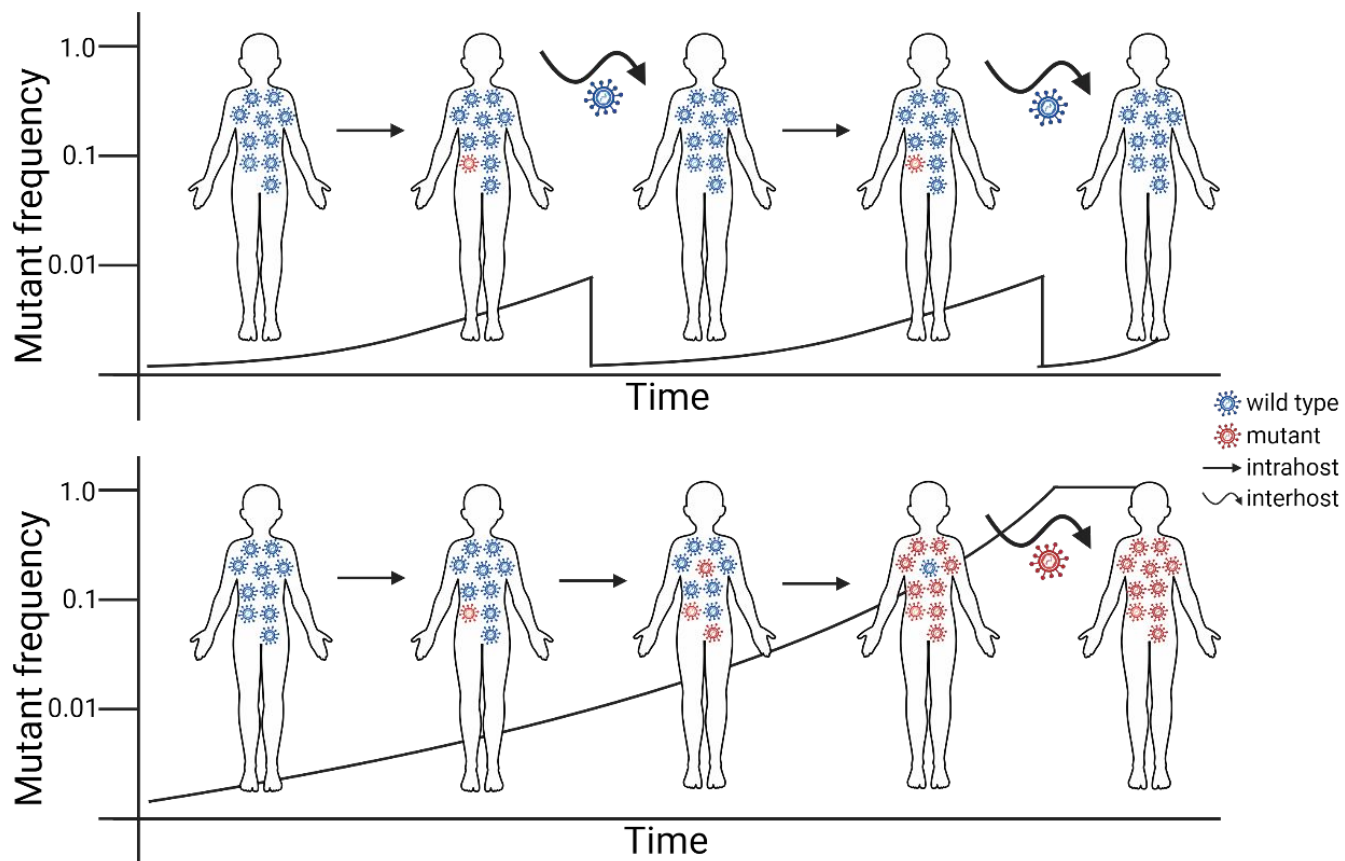
Khan et al, 2023

# Emergence of VOCs: probably chronic infections



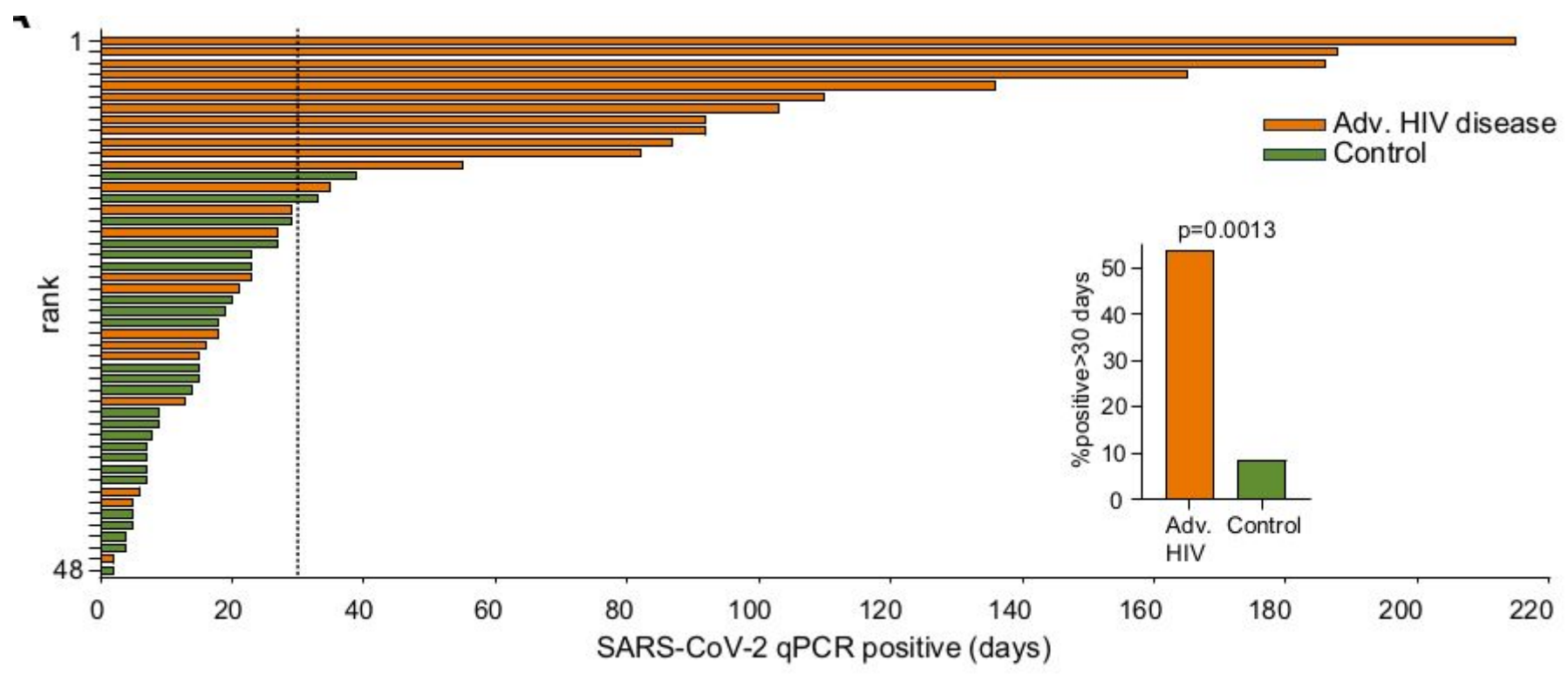
Chaguz et al, 2023

# Adaptation is more efficient in chronic vs acute infection

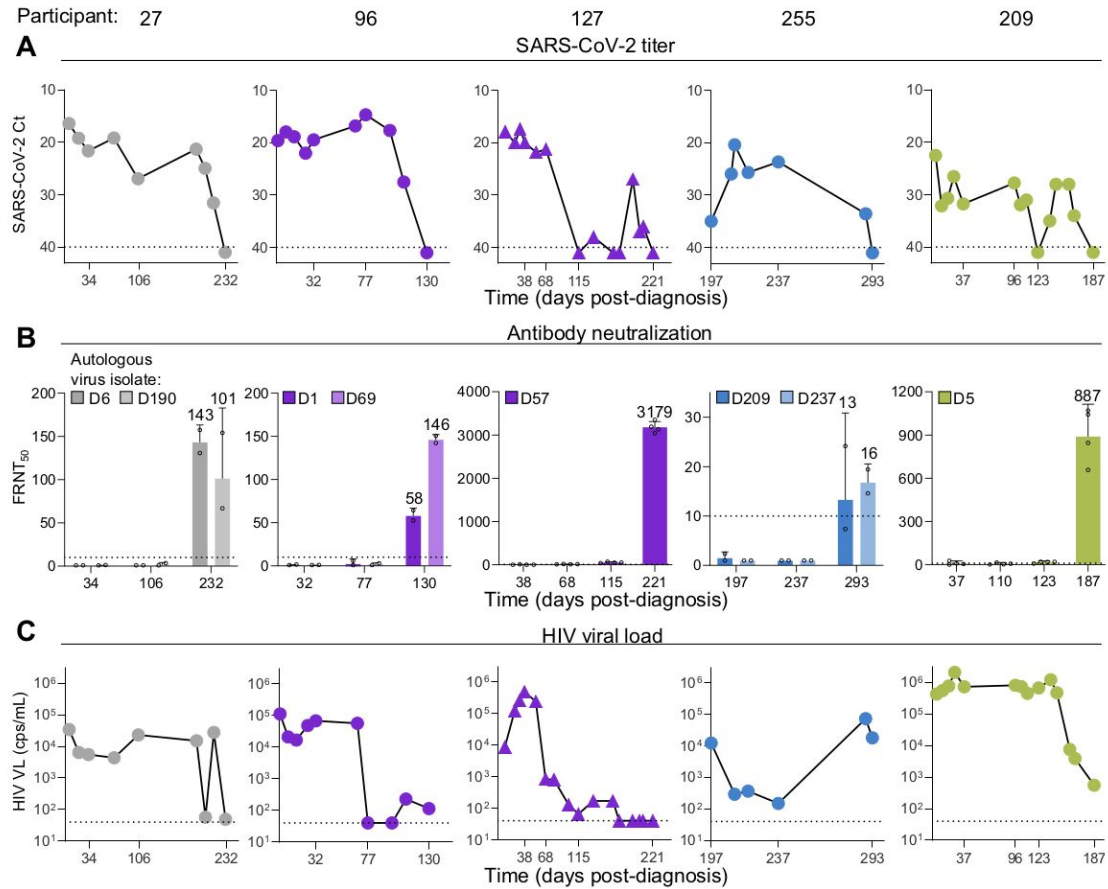


Sigal et al, in prep.

# Persistent infections are common in people with advanced HIV

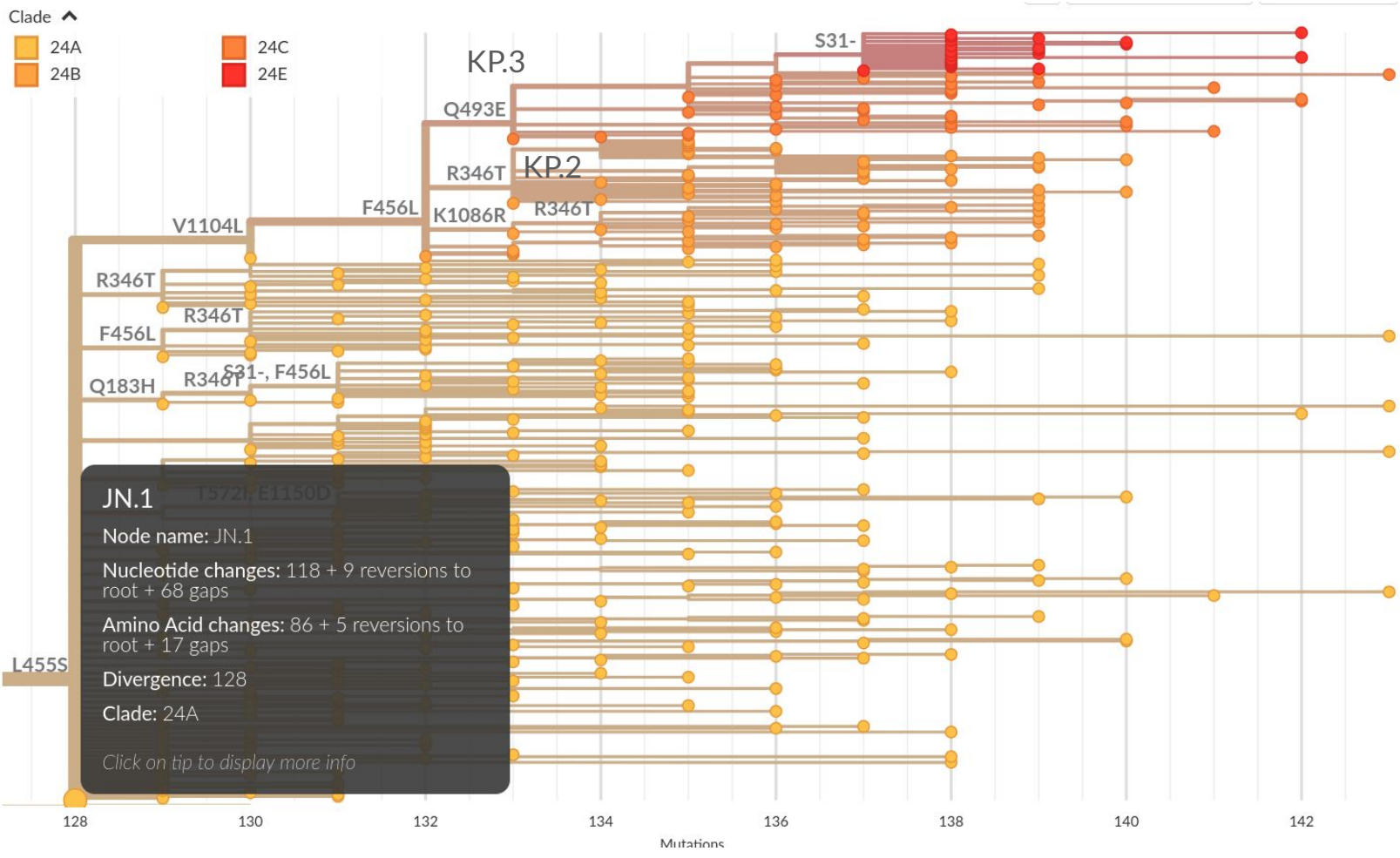


# SARS-CoV-2 is cleared with HIV suppressed, AB titers go up.

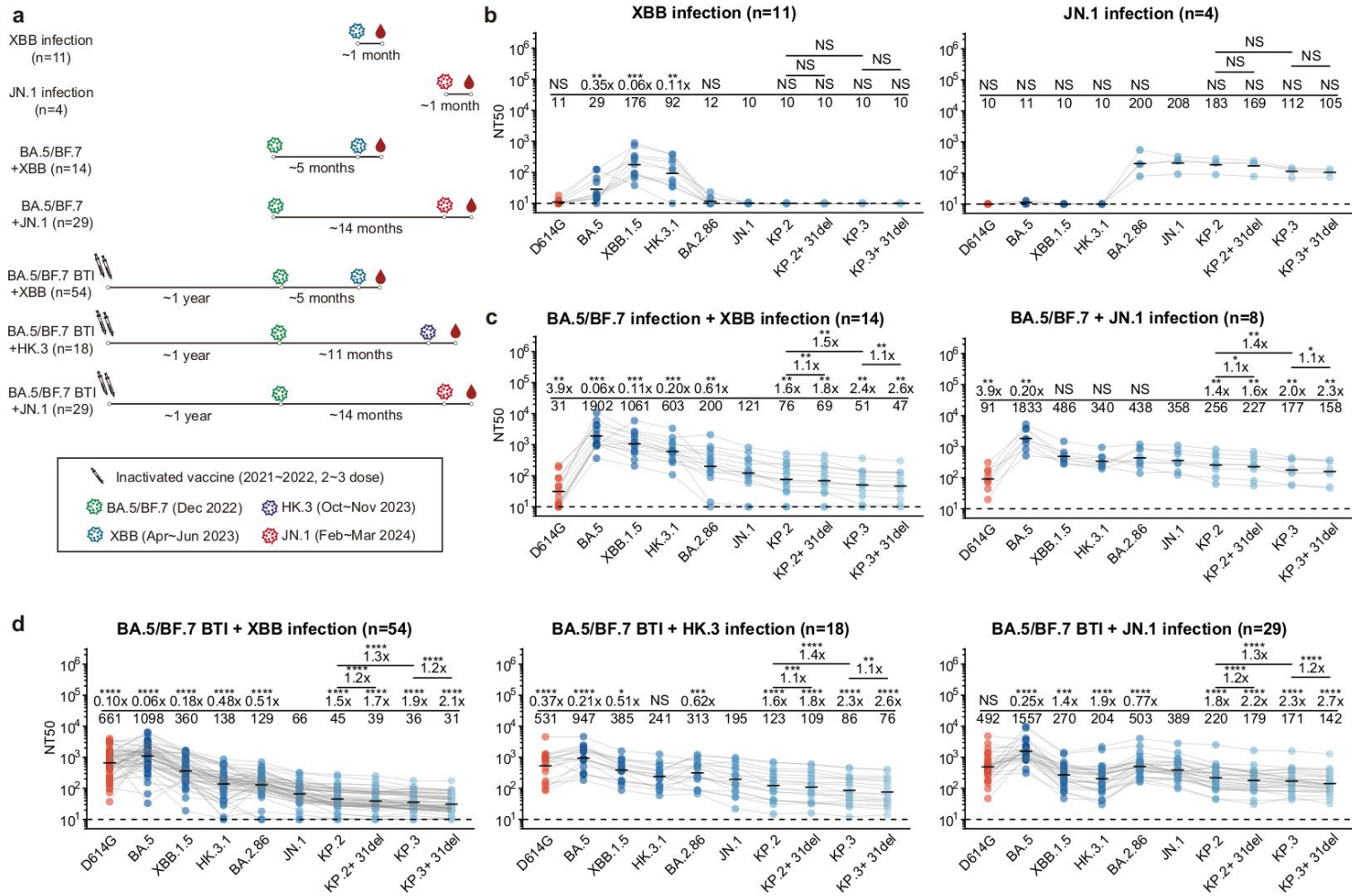


Clade ^  
24A  
24B

24C  
24E



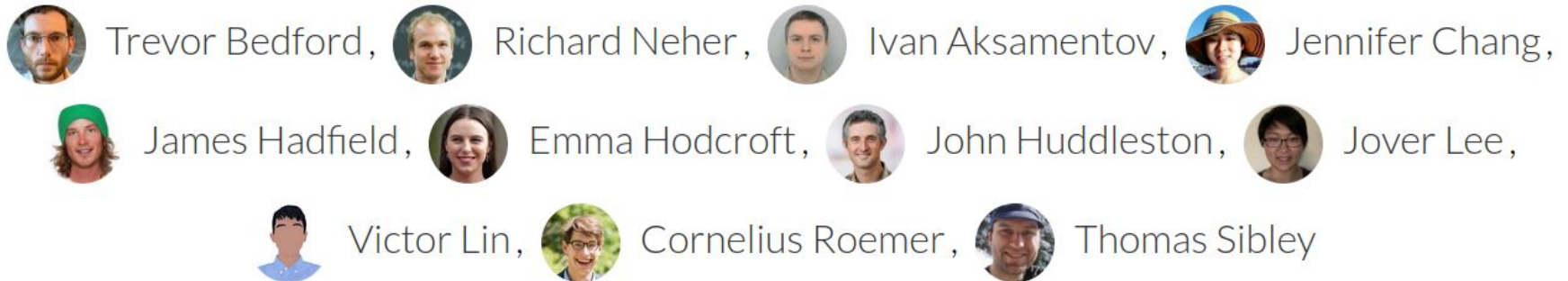






# Acknowledgements

- Jesse Bloom, Erick Matsen, Hugh Haddock, Georg Angehrn
- Cornelius Roemer & Ivan Aksamentov
- Alex Sigal and team!
- Sequence data contributors around the world (shared via GISAID or INSDC)



Nextstrain