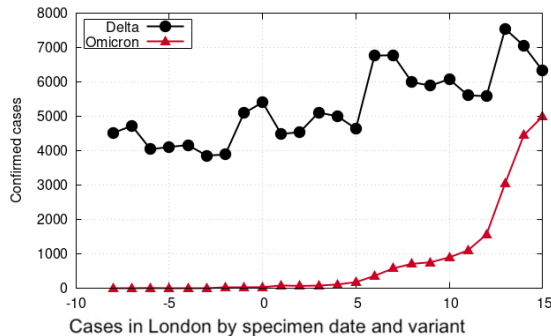
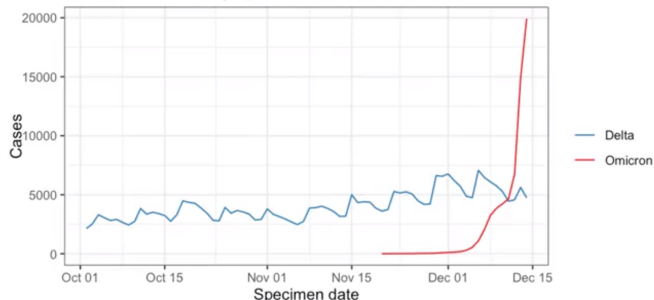


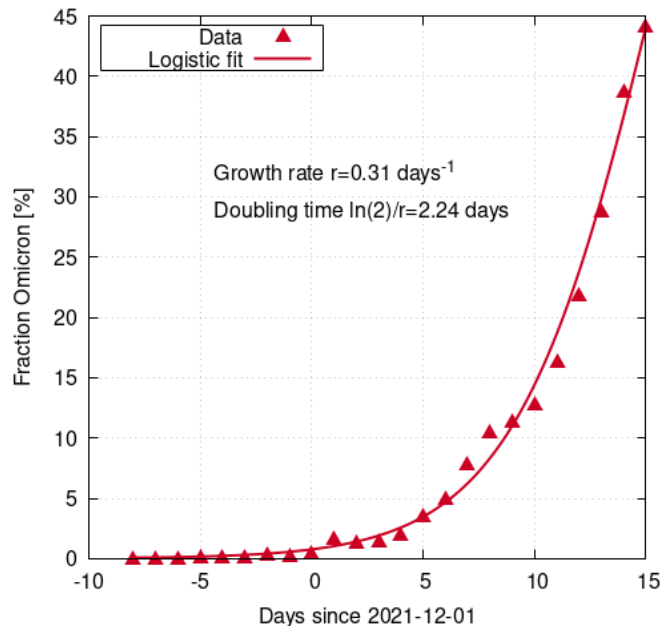
## Latest observation 1



- ▶ The Delta and Omicron variants coexist without directly affecting each other
- ▶ Indirect interaction via competing for common resources, i.e., *first come, first served*



## Latest observation 2



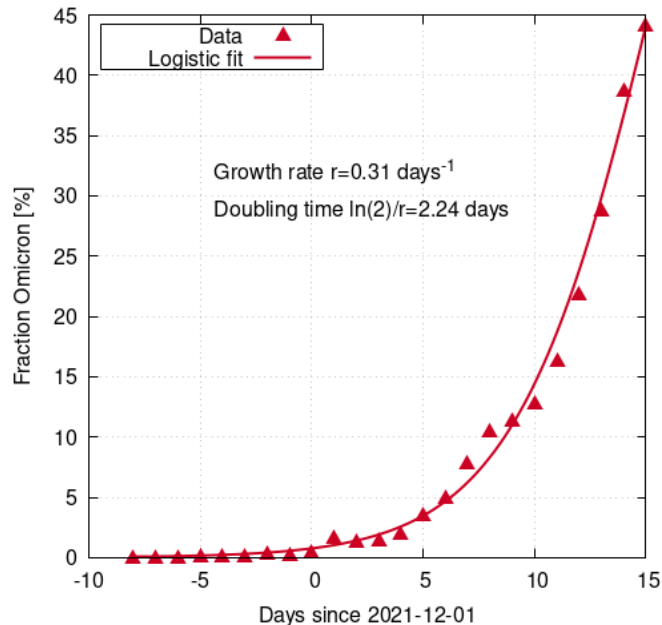
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- ▶ From Observation 1 (coexistence), it follows that the odds ratio grows exponentially:

$$y(t) = y_0 e^{rt}$$

- ▶ Transforming back gives the s-shaped predicted Omicron share (logistic function)

$$p(t) = \frac{y(t)}{1 + y(t)}$$

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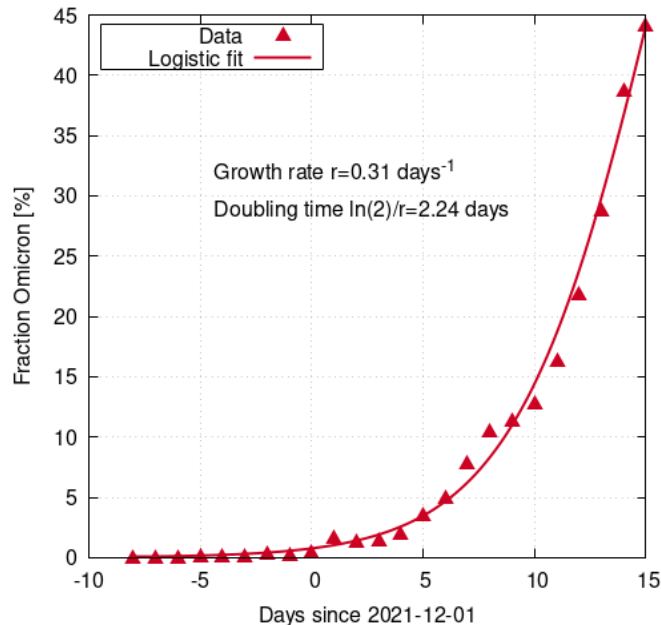
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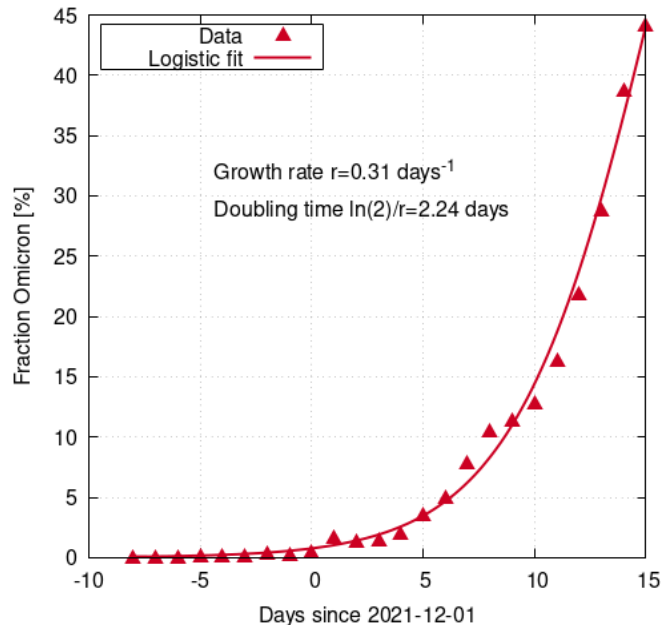
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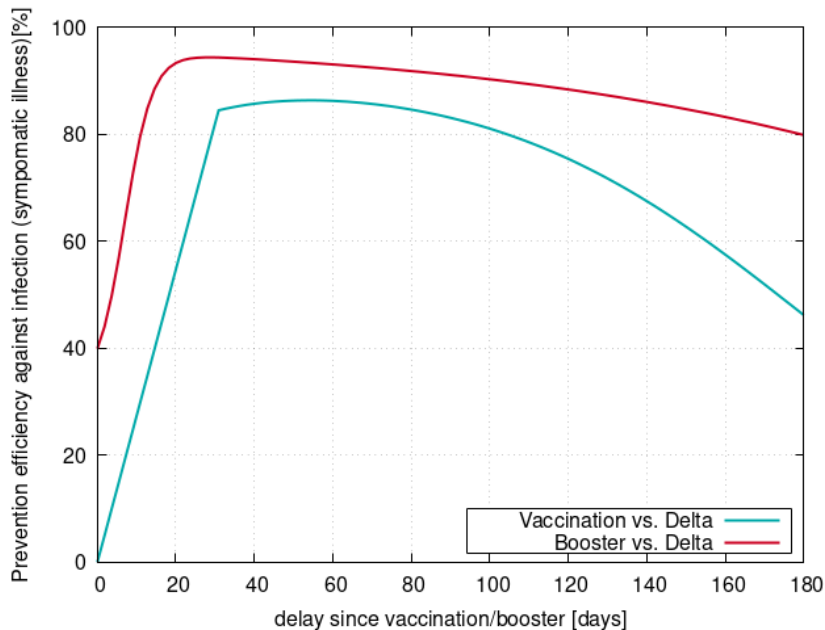
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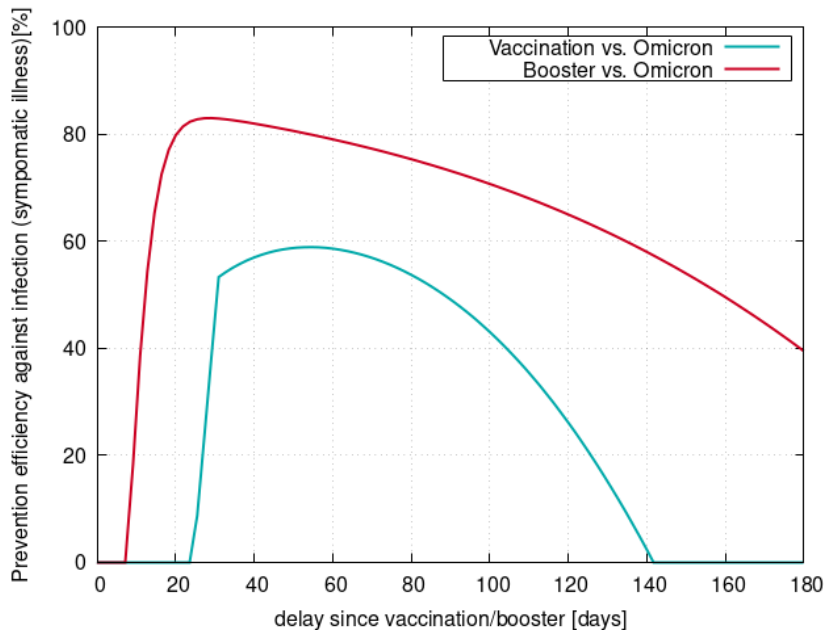
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## Assumed efficiency against Delta infections



“First vaccinated-  
first boosted”  
principle

## Assumed efficiency against Omicron infections



Only fresh  
full vaccinations  
or boosters  
help against  
Omicron

## Assumed immunity by infections

- ▶ 100 % immunity of Delta against Delta reinfections
- ▶ 100 % immunity of Omicron against Omicron reinfections
- ▶ 100 % no cross immunity (people can get both Delta and Omicron infections)



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## Putting it all together

- (1) The spreading of the fraction  $p$  new variant (Omicron) at the cost of the old variants (Delta) is logistic:

$$p(t) = \frac{y_0 e^{rt}}{1 + y_0 e^{rt}}, \quad y_0 = \frac{p_0}{1 - p_0}$$

- (2) The growth rate  $r$  of the logistic growth depends on

- ▶ the base reproduction numbers  $R_{10}$  and  $R_{20}$ ,
- ▶ the total population immunities (vaccination, boosters, infections)  $I_1$  and  $I_2$  against each variant,
- ▶ the generation time  $T$  of the infections (assumed to be equal, 5 days):

according to

$$r = \frac{1}{T} \left[ \frac{R_{20}(1 - I_2)}{R_{10}(1 - I_1)} - 1 \right] \quad (1)$$

*Notice:* Since the  $I_i$  are time dependent, so is the growth rate  $r$

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- (3) Assuming no cross effects, the effective  $R_t$  value caused by the mixture of the Delta and Omicron viruses depends on
- ▶ the Omicron percentage  $p$
  - ▶ the base reproduction numbers  $R_{10}$  and  $R_{20}$  of Delta and Omicron, respectively,
  - ▶ the immunity escape fractions  $(1 - I_1)$  and  $(1 - I_2)$ ,
  - ▶ the seasonal multiplier  $f^{\text{season}}$
  - ▶ the stringency (lockdown) multiplier  $f^{\text{stringency}}$ :

$$R_t = [(1 - p)R_{10}(1 - I_1) + pR_{20}(1 - I_2)] f_{\text{season}} f_{\text{stringency}} \quad (2)$$

- ▶ *Notice:* Both the **growth rate**  $r$  of the increase of the Delta share and the **growth rate**  $(R_t - 1)/T$  of the actual infection wave depend on  $P_1 = R_{10}(1 - I_1)$  and  $P_2 = R_{20}(1 - I_2)$  such that a positive (negative) value of  $r$  implies an increase (decrease) of  $R_t$
- ▶ A positive Omicron spreading  $r$  does **not** imply that the new variant is more infectious; only the products  $P_1$  and  $P_2$  matter
- ▶ A **positive** spreading  $r$  can be related to a **negative** infection growth  $(R_t - 1)/T$  both before *and* after the new variant dominates since, for given  $I_1$  and  $I_2$ ,  $r$  is only related to the *ratio*  $R_{20}/R_{10}$  of the base immunities  $\Rightarrow$  next slide



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## Estimating the base reproduction numbers

Assume at time  $t = t^*$  given population immunities  $I_1^*$  and  $I_2^*$  (see later), and estimations of the Omega share  $p^*$ , Omicron spreading rate  $r^*$ , and effective reproduction number  $R_t^*$  of the mixture. Then, we can use Eq (1) to obtain the ratio

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and, with Eq (2) determine the base reproduction numbers individually:

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For  $t > t^*$ , I assume fixed base reproduction numbers and calculate the future Omicron spreading and the future wave using (1) and (2) with time varying  $I_1$ ,  $I_2$ ,  $p$ ,  $f_{\text{season}}$ , and  $f_{\text{stringency}}$

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## Determining the population immunities I: vaccinations

Here, I make following assumptions

- ▶ Vaccination efficiency curves  $I_1^v(\tau)$  and  $I_2^v(\tau)$  against Delta and Omega as shown,
- ▶ corresponding booster efficiencies  $I_1^b(\tau)$  and  $I_2^b(\tau)$ ,
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## Determining the population immunities II: infections and total

- Everybody can only be infected once with any variant but there is no cross immunity, so the immunity is just equal to the total percentage  $X_1$  and  $X_2$  of people infected with either variant:

$$I_1^x = X_1, \quad I_2^x = X_2$$

*Notice:*  $X_i$  is not just the cumulated number of cases divided by the population because any infection, whether detected or not detected, counts

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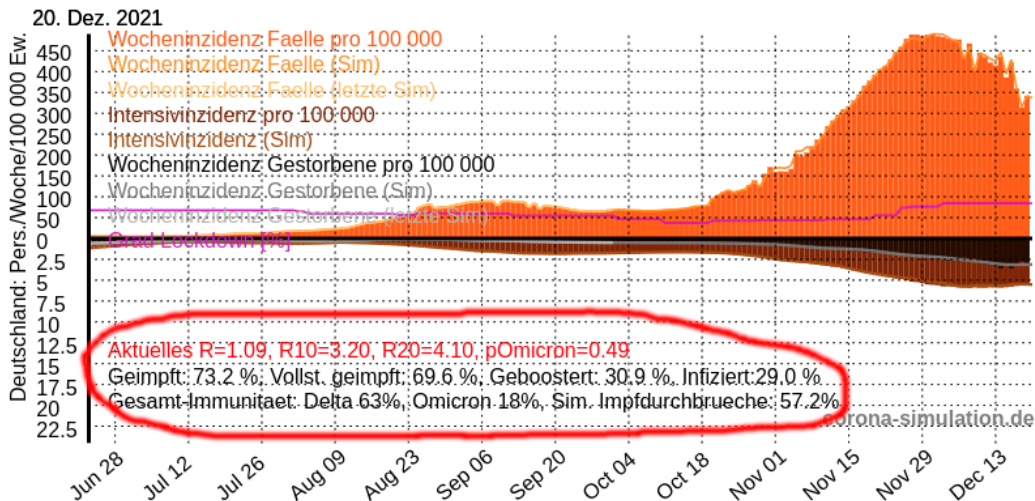
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## Simulation



All items  $I_1$ ,  $I_2$ ,  $p$ ,  $R_{10}$ ,  $R_{20}$ ,  $f_{\text{season}}$  and  $f_{\text{stringency}}$  are displayed in the simulation