



UMC Utrecht

# Controlling the pandemic during the SARS-CoV-2 vaccination rollout

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Evolutionary Implications of the COVID-19 Vaccination Programme

19 April 2021



# Collaborators

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Making the way out:  
model-based evaluation of exit strategies  
from the COVID-19 lockdown in Portugal

# Preprint



In review in *Nature Communications*

Viana J, van Dorp C, Nunes A, Gomes M, van Boven M, Kretzschmar M, Veldhoen M, Rozhnova G (2021). Controlling the pandemic during the SARS-CoV-2 vaccination rollout: a modeling study

<https://doi.org/10.21203/rs.3.rs-358417/v1>



GitHub

<https://github.com/lynxgav/COVID19-vaccination>

medRxiv

THE PREPRINT SERVER FOR HEALTH SCIENCES



BMJ Yale

## Controlling the pandemic during the SARS-CoV-2 vaccination rollout: a modeling study

João Viana,  Christiaan H. van Dorp,  Ana Nunes, Manuel C. Gomes, Michiel van Boven,  Mirjam E. Kretzschmar,  Marc Veldhoen,  Ganna Rozhnova

doi: <https://doi.org/10.1101/2021.03.24.21254188>





**Operação Marquês**  
Quando se fala de corrupção, portugueses lembram-se de Sócrates e de Salgado

Sociedade, 14/15 e Editorial

Leia mais em [publico.pt/operacao-marques](http://publico.pt/operacao-marques)

## Ritmo de vacinação e reabertura total das escolas podem levar a quarta vaga

Média de contactos diários na população pode atingir níveis semelhantes aos do Outono passado

O ritmo previsto de vacinação contra a covid-19 e o suficiente para controlar a pandemia em Portugal. Os autores de um estudo que avalia o impacto do alargamento das medidas de controlo, a par da campanha de vacinação em curso, afirmam que se aliado às restrições incluídas a reabertura total das escolas e dos espaços interiores de bares e restaurantes, é provável que a média de contactos diários atinja níveis similares aos do Outono passado e, consequentemente, ocorra nova vaga de hospitalizações. Destaque, 2 a 4

**Teletrabalho**  
Sindicatos exigem despesas na lei, patrões querem acordos

Confederações sindicais e patronais estão divididas quanto à forma como a lei deve regular as despesas do teletrabalho. Economia, 26

**Apoio do Estado**  
Governo desafia oposição a mudar lei sobre independentes

Executivo defende que o texto aprovado se traduz num apoio mais difícil de concretizar e que prejudicará "muitas pessoas". Economia, 27

**EUA**  
Estrela dos republicanos sob suspeita de tráfico sexual

Matt Gaetz, um dos favoritos de Trump, terá mantido uma relação com uma menor e pode vir a ser acusado de tráfico sexual. Mundo, 19

**idealista**

O portal imobiliário líder em Portugal

**Jornal Tarde** AMEAÇA 4ª VAGA  
Estudo de investigadores portugueses e holandeses conclui que maio trará nova onda  
13:07 00:00 02:16

# Background

- Portugal experienced three waves of COVID-19
- Vaccination started at the end of December 2020
- Struggle to choose the right mix of measures to keep COVID-19 under control but to allow for social and economic activity



# Objectives

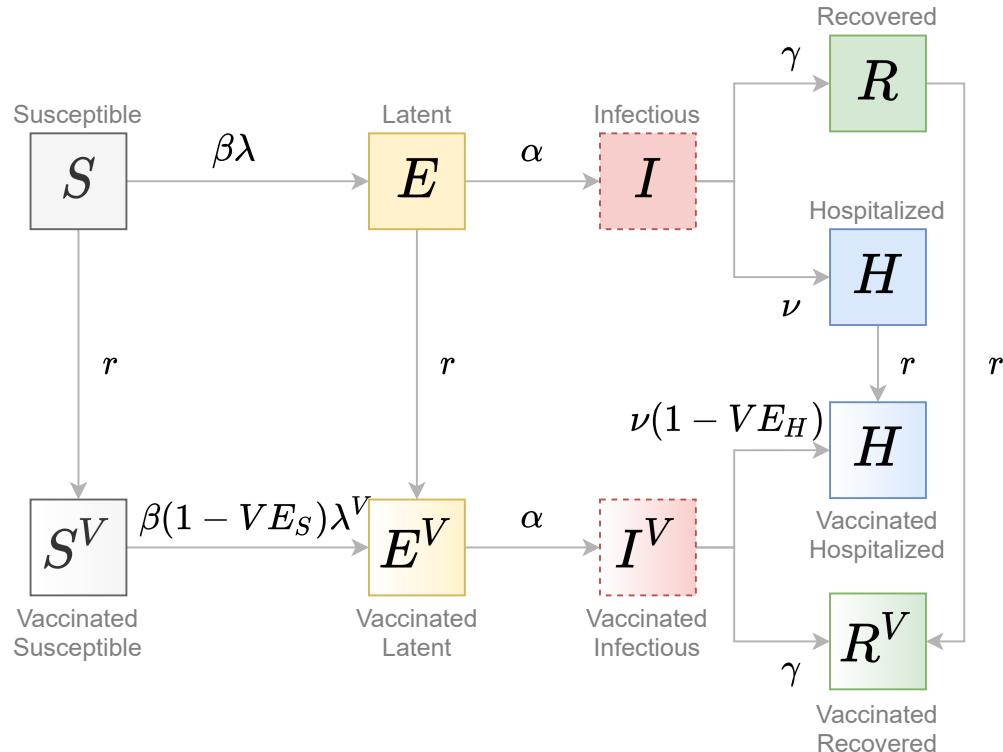
- What is the impact of vaccination on the transmission dynamics of SARS-CoV-2 in Portugal?
- When and which control measures can be relaxed as the vaccination is rollout in 2021?
- How are predictions affected if vaccine efficacy was reduced due to antigenic escape variants?

Moore et al. *Lancet Infectious Diseases*. 18 March 2021.  
doi: [10.1016/S1473-3099\(21\)00143-2](https://doi.org/10.1016/S1473-3099(21)00143-2)

Scientific Advisory Group for Emergencies. Report. 18 February 2021.



# Transmission model



## Age-specific parameters

$\beta$  - susceptibility  
 $\lambda, \lambda^V$  - forces of infection  
 $\nu$  - hospitalization rate  
 $r$  - vaccination rate

## Constant parameters

$1/\alpha$  - latent period  
 $1/\gamma$  - infectious period  
 $VE_S$  - vaccine efficacy in reducing susceptibility  
 $VE_I$  - vaccine efficacy in reducing infectivity (not shown)  
 $VE_H$  - vaccine efficacy in preventing hospitalization/death

- 10 age classes/hospitalization classes/vaccination classes
- 3 susceptibility classes (Jing et al. *Lancet Inf Dis* 2020; Goldstein et al. *JID* 2020)
- 5 seroprevalence classes

# Data & Fitting

The model is fitted to two data sets

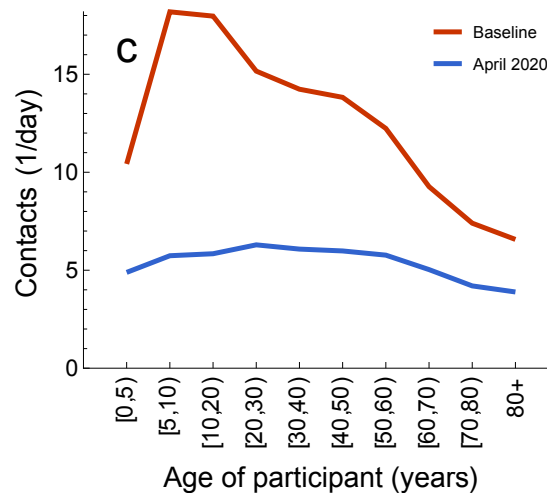
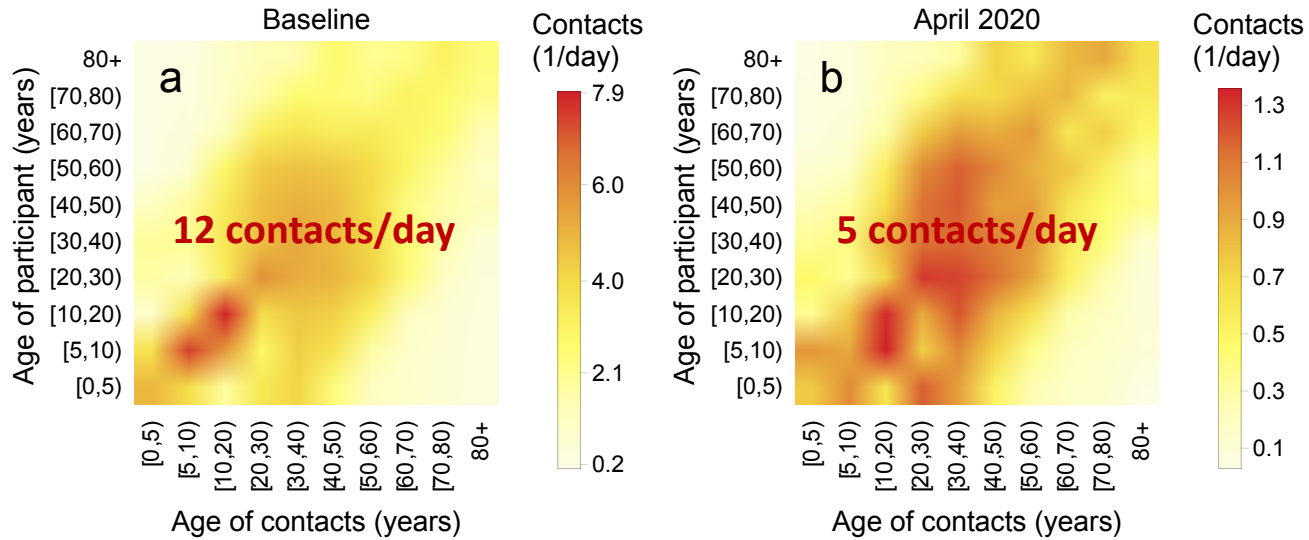
- **Data 1:** age-stratified hospital admissions (n = 28,482)
- Period: 325 days after the first case (2 March 2020 – 15 January 2021)
- Start of the epidemic: 26 February 2020
- **Data 2:** Age-stratified serological data (n = 2,301)
- Date: 28 May 2020
  
- Bayesian framework using Stan with R interface
- 32 parameters are estimated

Rozhnova et al. *Nature Communications* 12, 1614 (2021) Model-based evaluation of school- and non-school-related measures to control the COVID-19 pandemic.





# Contact patterns



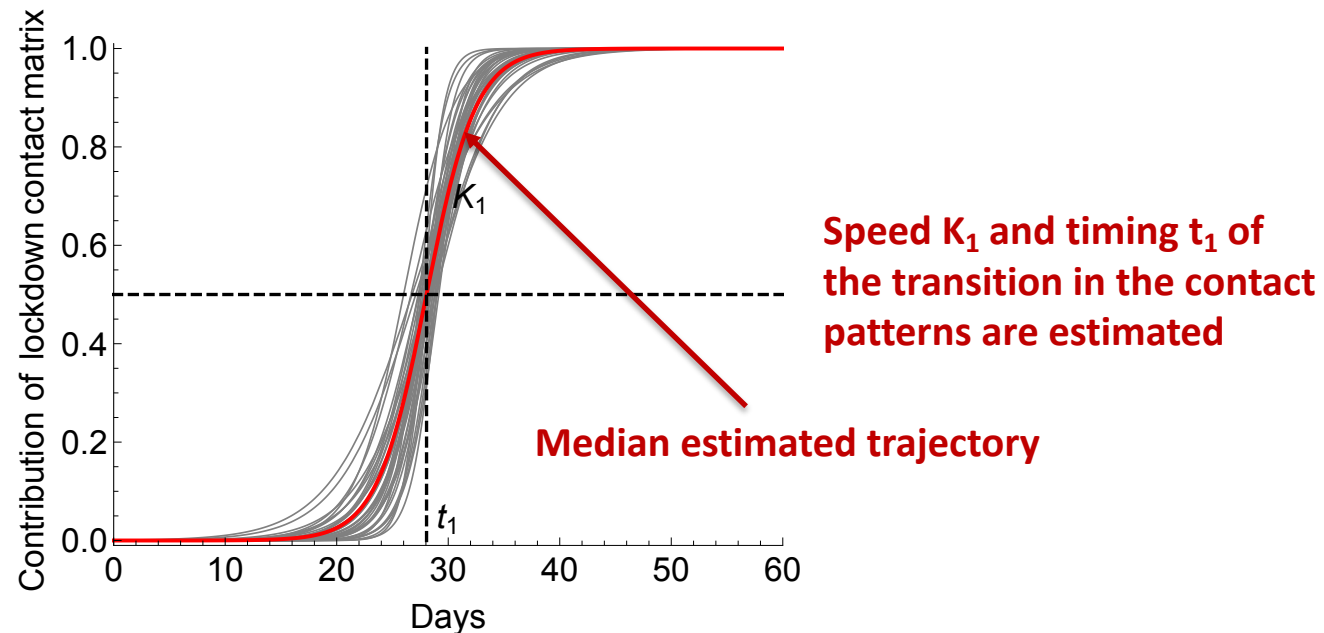
**60% reduction in contacts**

Mistry et al. *Nat Com* 12, 323 (2021)  
Backer et al. *Eurosurveillance* 26 (2021)

# First lockdown transition

We use a linear combination of matrices before and after lockdown

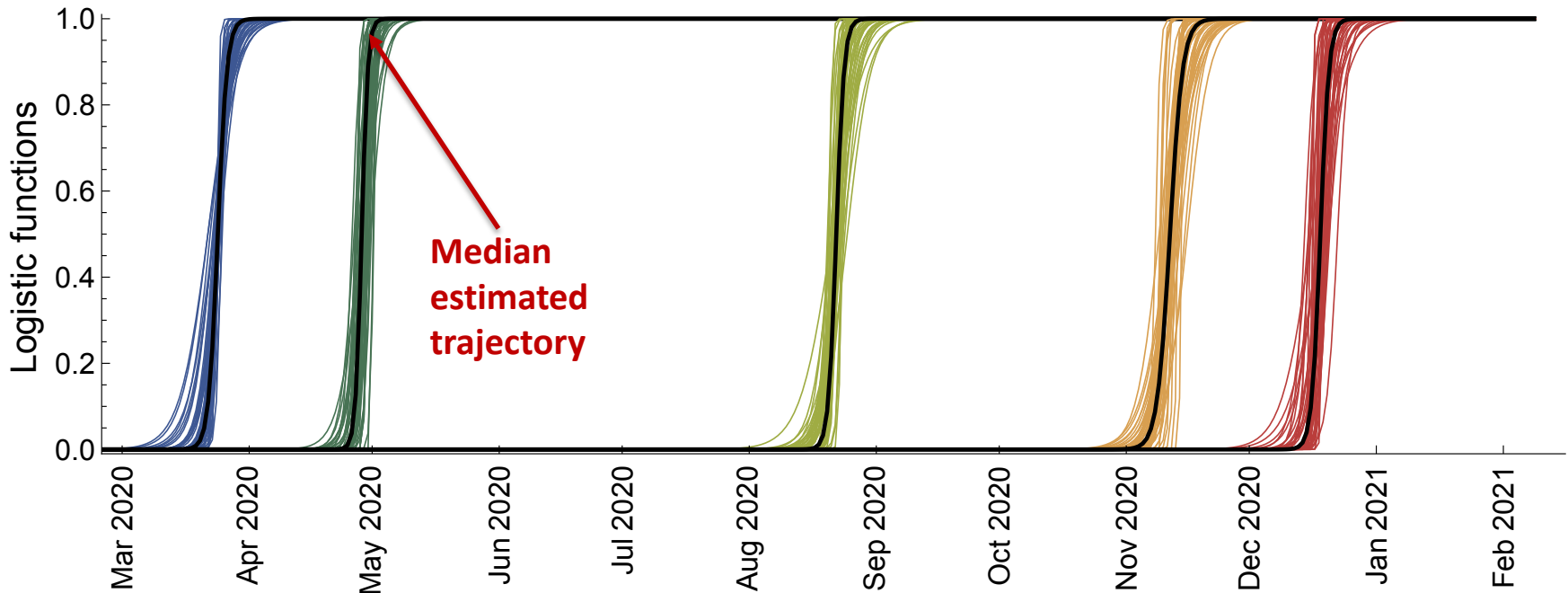
$$c_{kl} = [1 - f(t)]b_{kl} + \zeta_1 f(t)a_{kl} \quad f(t) = \frac{1}{1 + e^{-K_1(t-t_1)}}$$



Rozhnova et al. *Nature Communications* 12, 1614 (2021) Model-based evaluation of school- and non-school-related measures to control the COVID-19 pandemic.



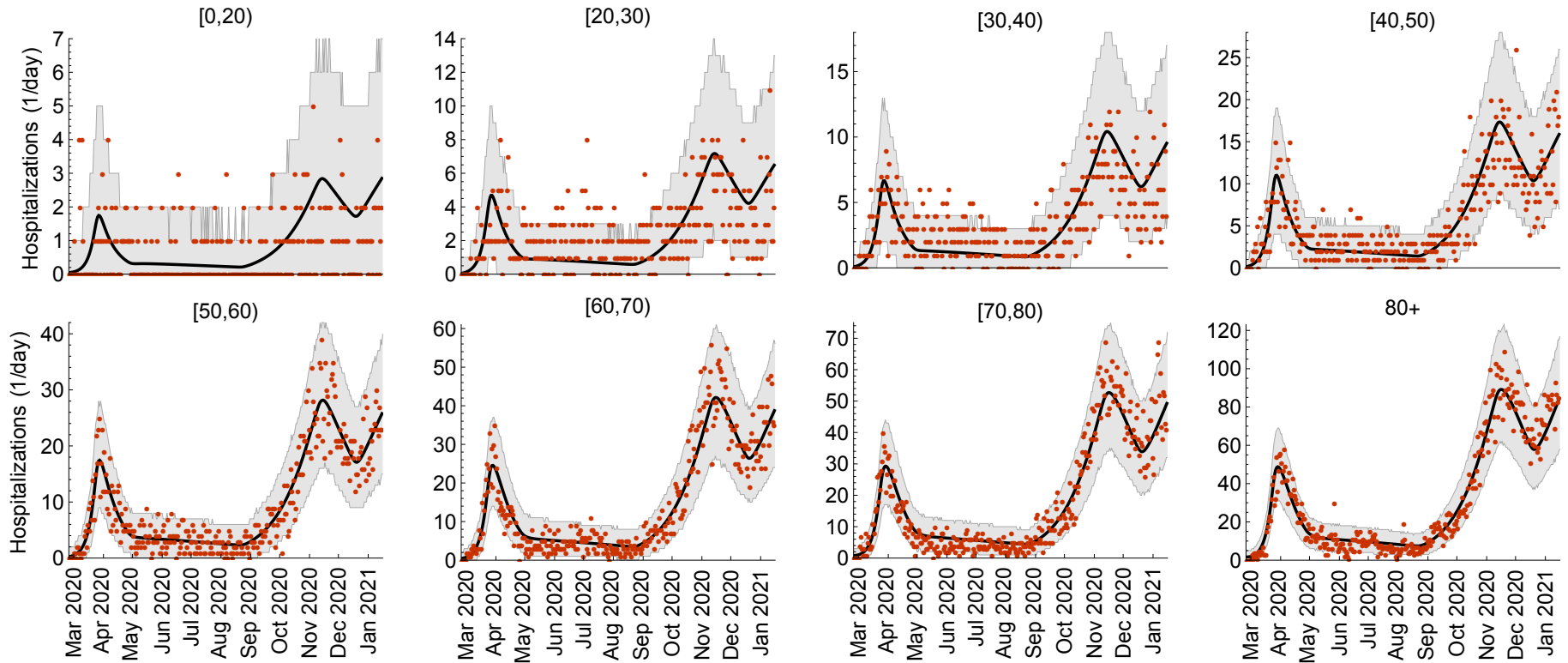
# Time-varying contact patterns



- First lockdown/1<sup>st</sup> Emergency State
- Relaxation of measures
- Further relaxation of measures (school opening)
- 2<sup>nd</sup> Emergency State
- Relaxation due to Christmas/New Year holidays



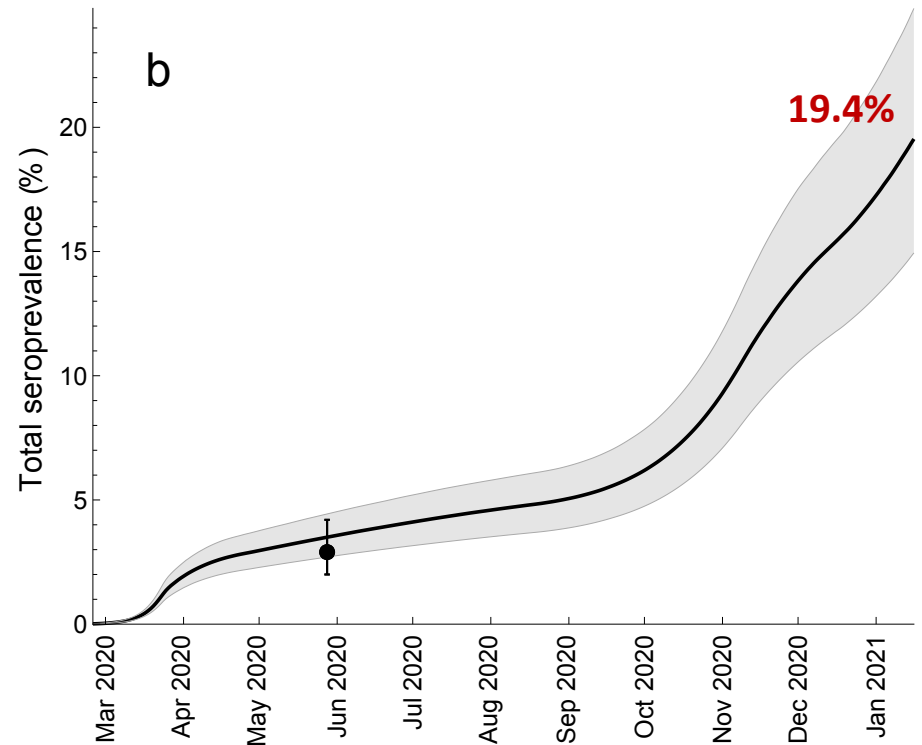
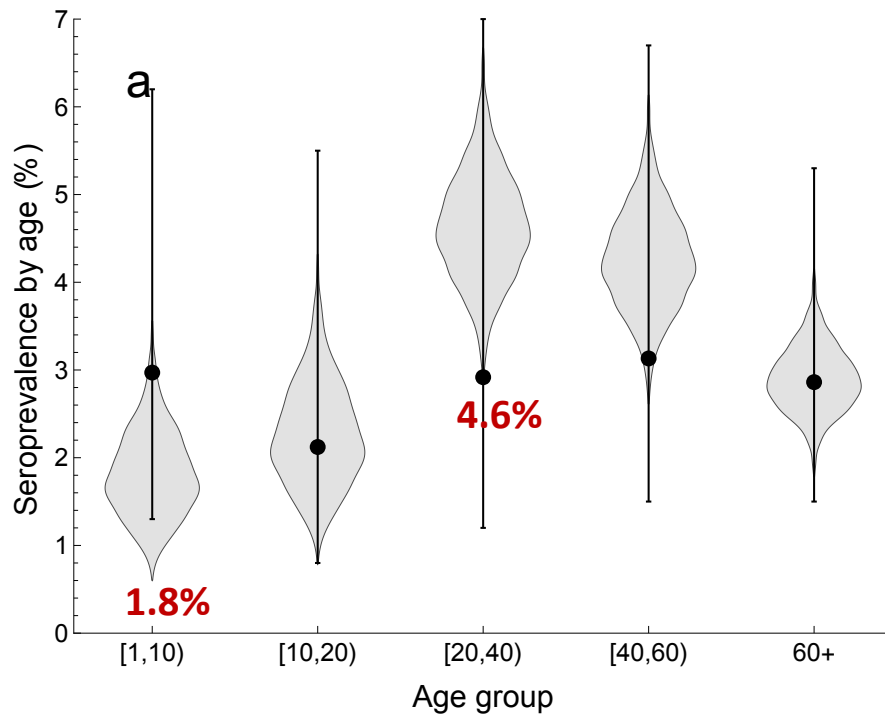
# Model fit: Hospital admissions



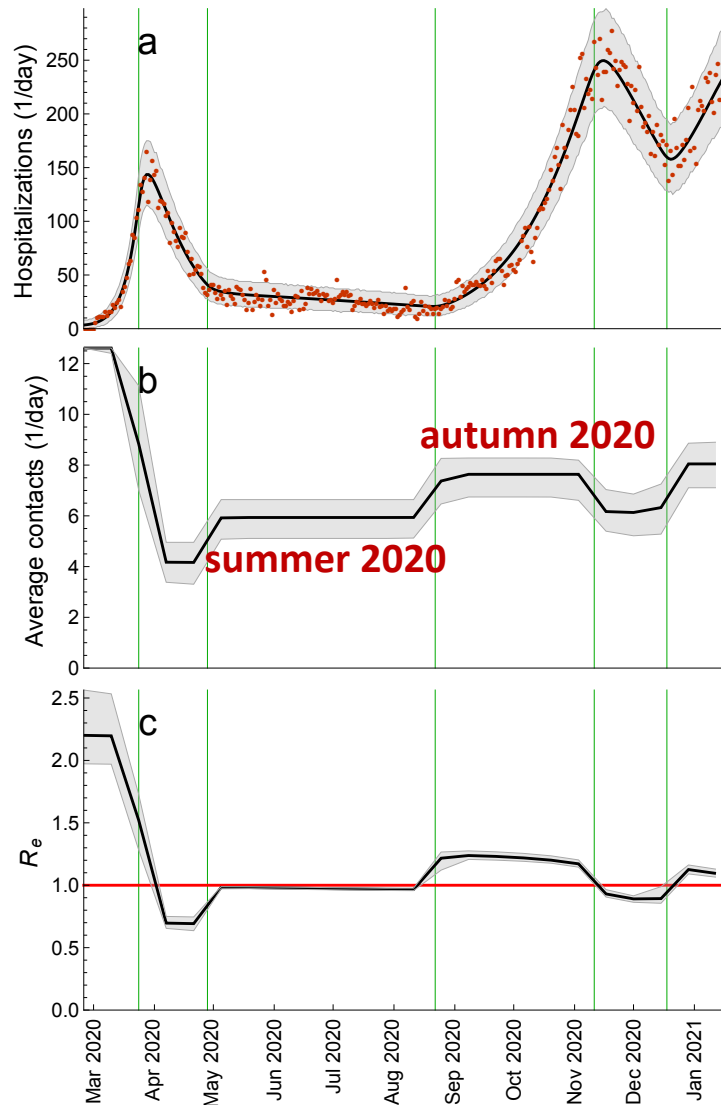
- 1<sup>st</sup> wave, low epidemic activity, 2<sup>nd</sup> & 3<sup>rd</sup> waves



# Model fit: Seroprevalence



# Time-varying contact patterns & $R_e(t)$



- $R_e(t)$  is calculated using the estimated level of seroprevalence
- $R_e(t) < 1$  & control measures in place  
**partial control**
- $R_e(t) < 1$  & pre-pandemic contacts  
**full control**

# Vaccination program

**Table 1. The Portuguese vaccination plan.**

Category	Age (years)	Vaccination period	Persons
<b>Phase 1</b>			<b>937,361</b>
Healthcare workers (HCW)	20 – 65	27 Dec 2020 – 28 Feb 2021	199,708
Long-term care facilities (LTCF)		01 Jan 2021 – 28 Feb 2021	148,119
Residents	65+		86,982
Staff	20 – 65		61,138
Risk Group 1	50+	01 Feb 2021 – 30 Apr 2021	513,634
Cardiac insufficiency			207,571
Coronary heart disease			169,265
Renal insufficiency			8,201
Chronic obstructive pulmonary disease (COPD)			128,597
First response professionals (FRP) (firemen, police, military etc.)	20 – 65	01 Feb 2021 – 30 Apr 2021	75,900
<b>Phase 2</b>			<b>3,333,191</b>
Persons with or without morbidities unvaccinated before*	65+	01 May 2021 – 31 Jul 2021	1,873,349
Risk Group 2	50 – 65	01 May 2021 – 31 Jul 2021	1,459,842
Diabetes			222,864
Neoplasm			114,246
Hepatic insufficiency			93,004
Chronic kidney disease			4,222
Obesity			392,959
High blood pressure			632,547
<b>Phase 3</b>			<b>6,529,448</b>
Remaining persons (excluding children)**	20 – 65	01 Aug 2021 – 31 Dec 2021	6,529,448
<b>Total*</b>			<b>10,800,000</b>

\*The Portuguese vaccination plan assumes that all persons in the population will be vaccinated with a two-dose vaccine schedule. In the model, the maximum vaccination coverage in any age group is 90%. \*\*According to the current guidelines, persons under 18 years old are not eligible for vaccination. In the model, we assumed that the age group of 0 to 20 years old is not vaccinated.

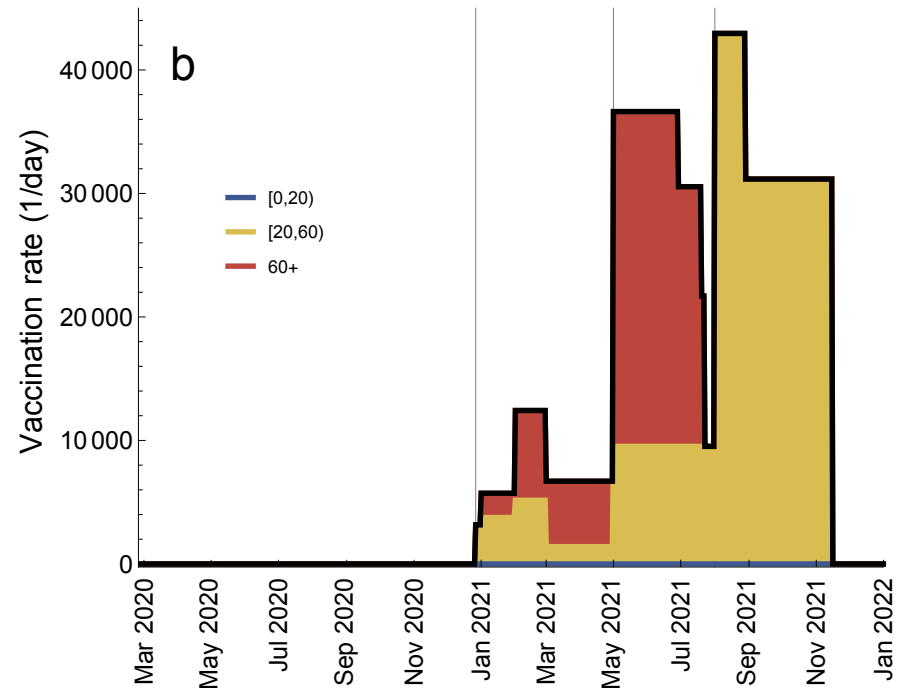
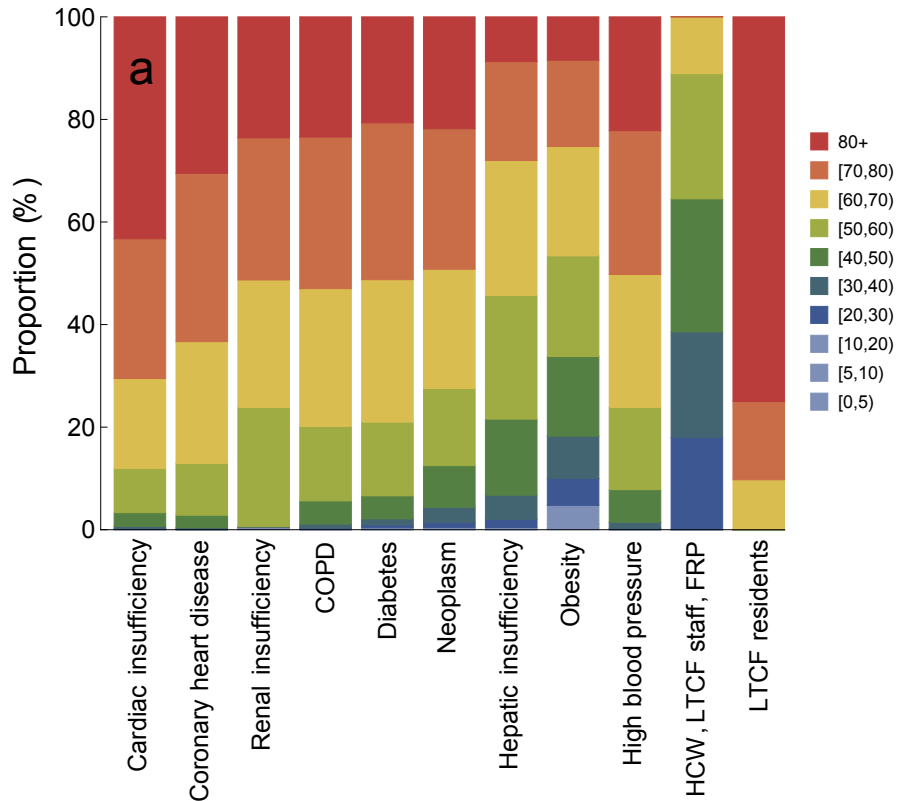
# Vaccination analyses

- Maximum vaccination coverage of 90% ([Makhoul et al. \*Vaccines\* 2021](#))
- Persons under 20 years of age are not vaccinated
- Vaccine efficacies for Pfizer vaccine (96% of total doses)
- Infection-blocking properties
- Vaccination is a single event conferring protection equivalent to 2 vaccine doses
- Optimistic and pessimistic sets of vaccine efficacies (94% vs 55% efficacy in reducing susceptibility; [Thompson et al. \*CDC\* 2021](#); [Moustsen-Helms et al. \*medRxiv\* 2021](#); [Chodick et al. \*medRxiv\* 2021](#))
- There is (no) behavior compensation in vaccinated persons





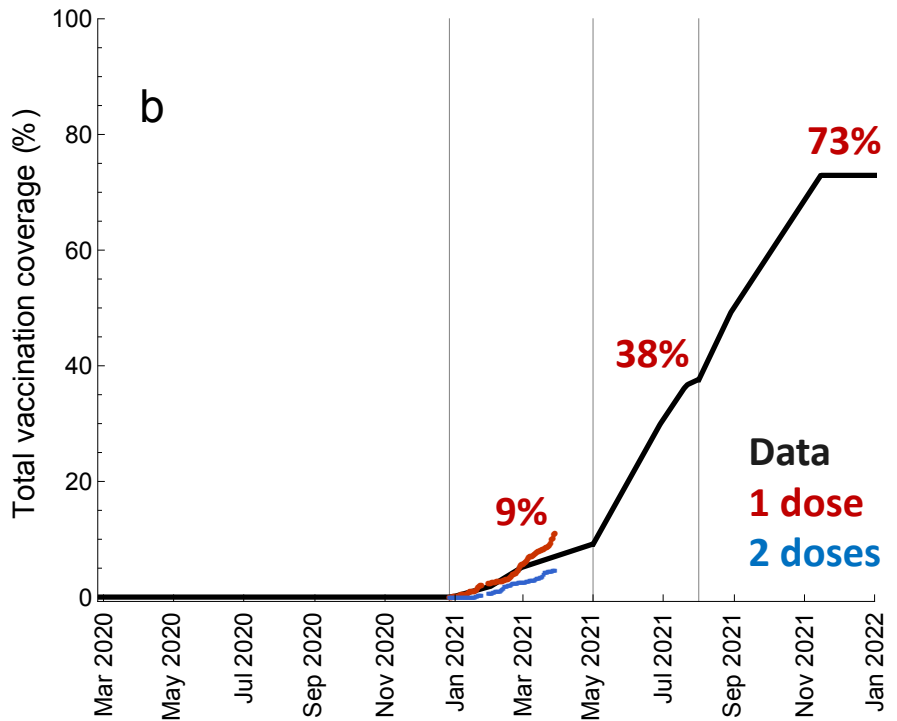
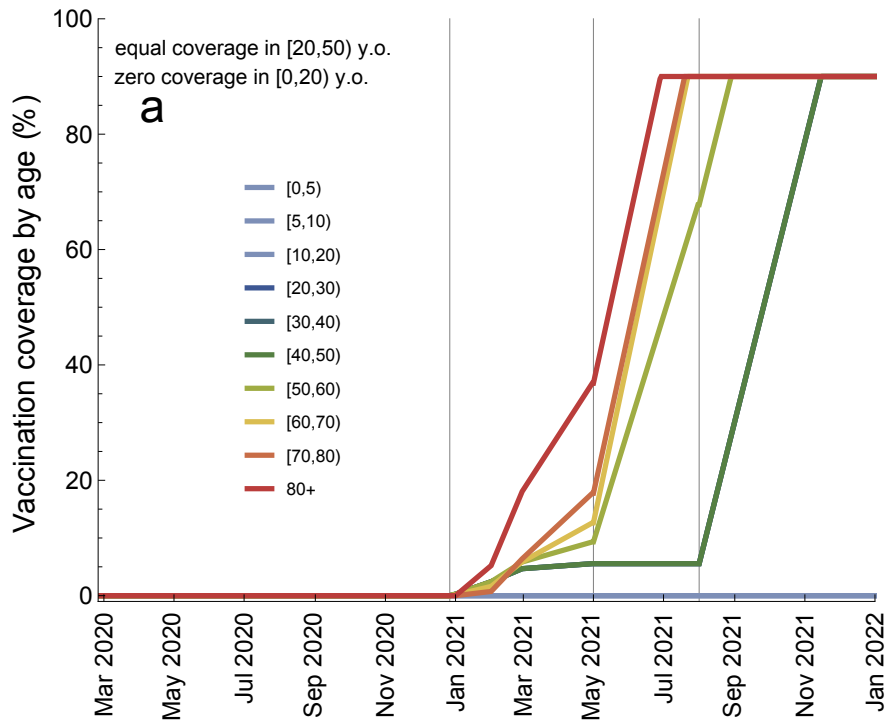
# Vaccination rollout schedule



- Morbidities in the vaccination plan are defined by ICPC-2 codes
- Data on the age distribution of morbidities from the Ministry of Health



# Vaccination coverage



- 80+ -> end of June 2021
- [60,80) -> 3<sup>rd</sup> week of July 2021
- [50,60) -> end of August 2021
- [20,50) -> mid-November 2021

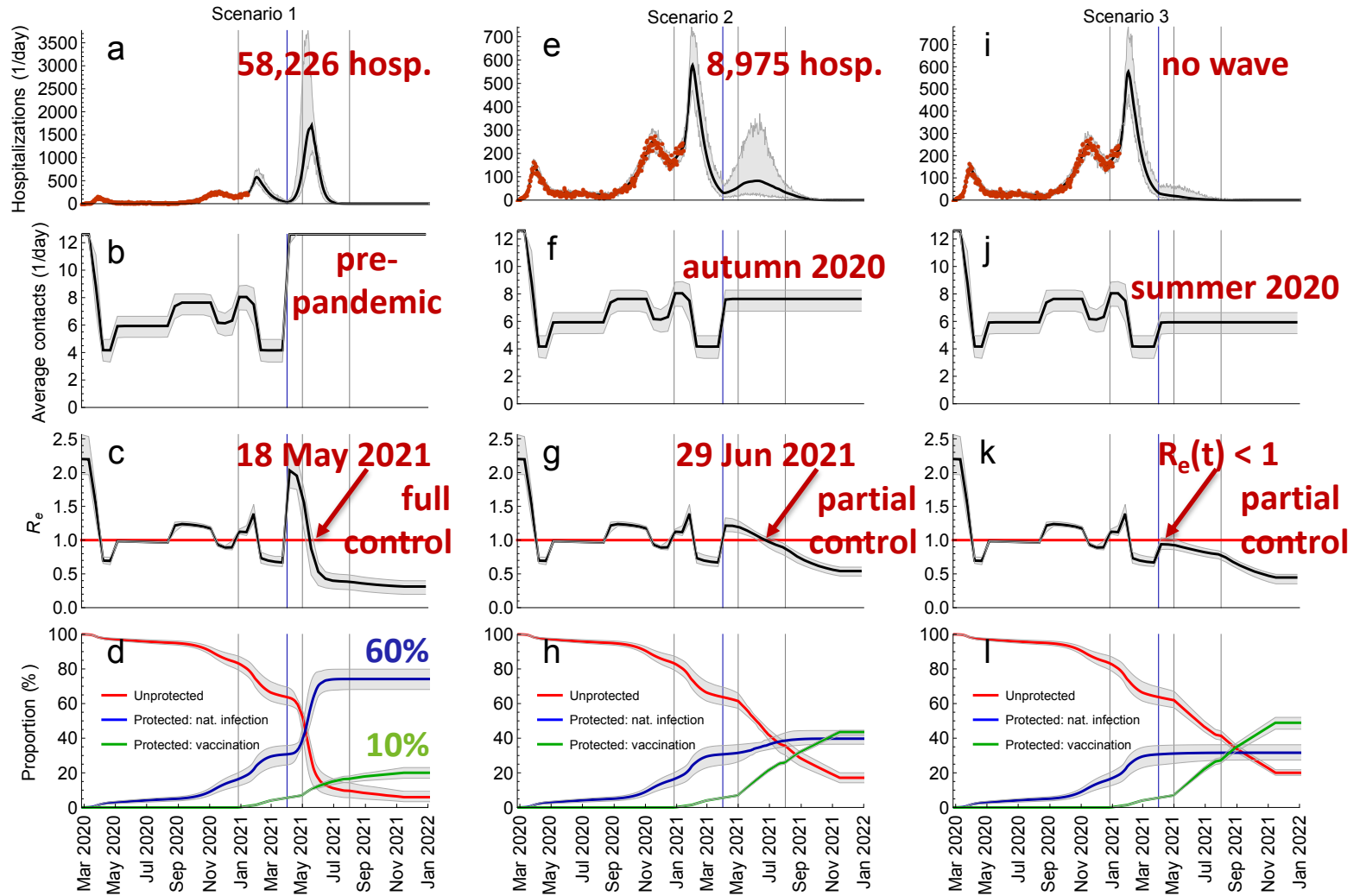


# Relaxation scenarios

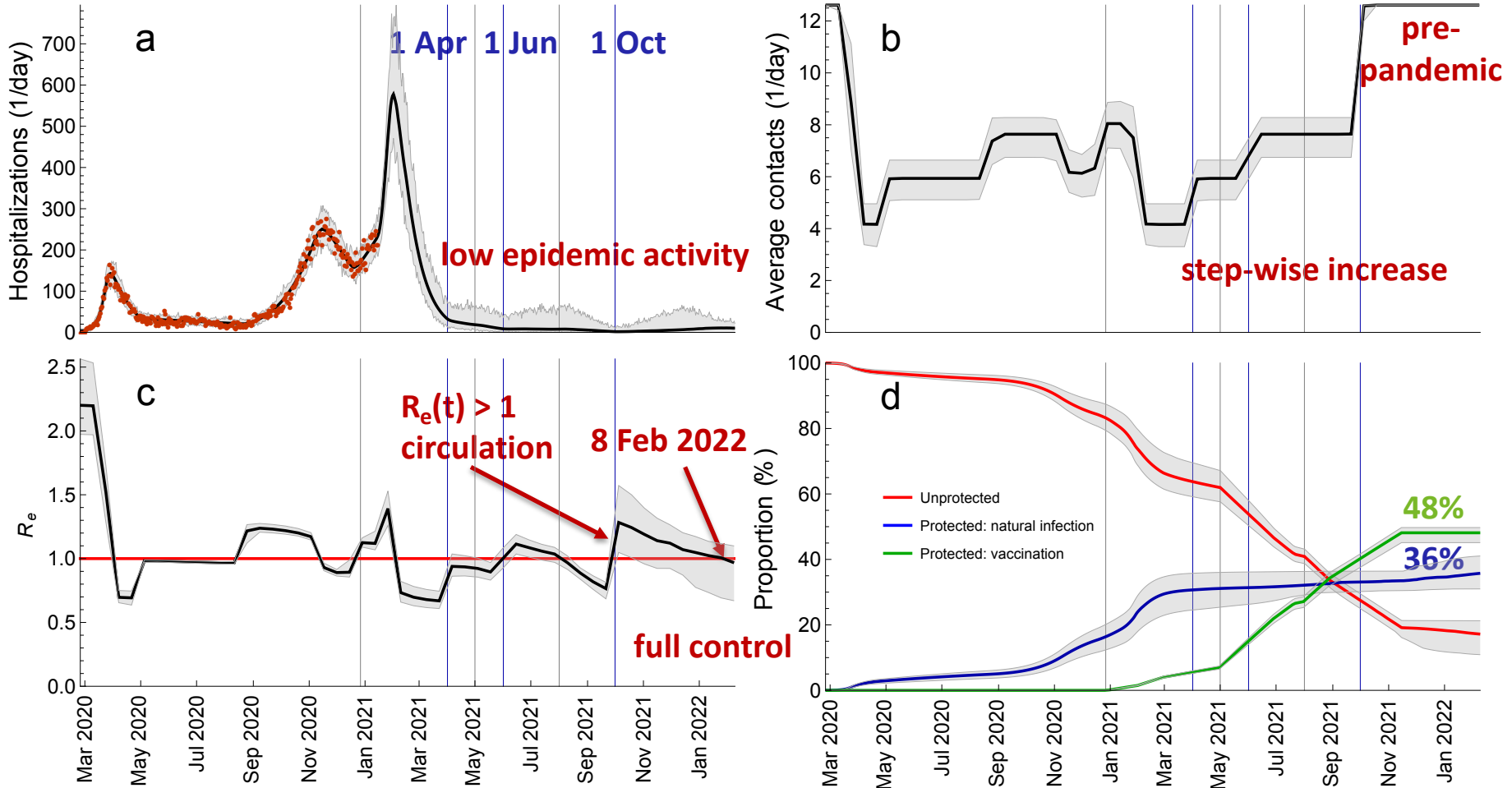
- **Scenario 1** Lifting all measures
- **Scenario 2** Partial lifting of measures as in autumn 2020
- **Scenario 3** Partial lifting of measures as in summer 2020
- **Scenario 4** Step-wise relaxation of measures



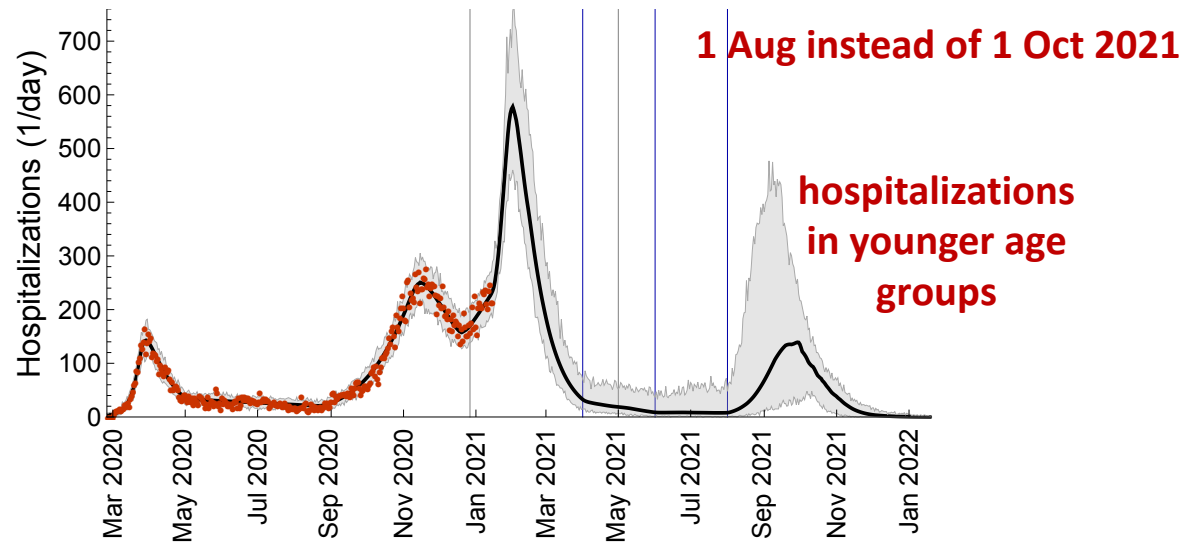
# Scenarios 1, 2, 3



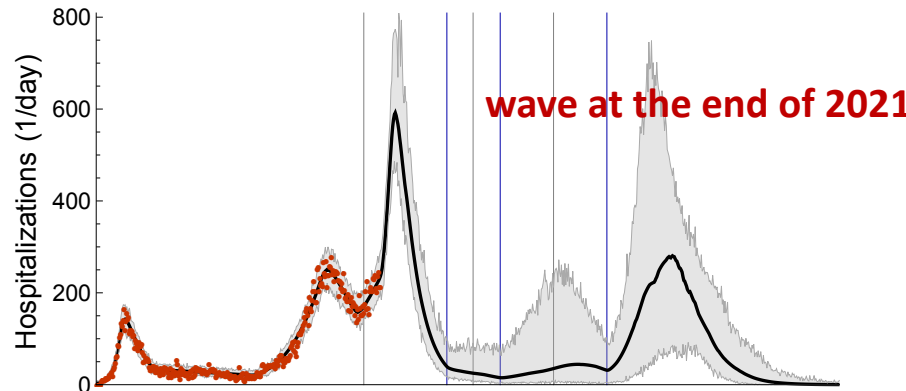
# Scenario 4: Step-wise relaxation



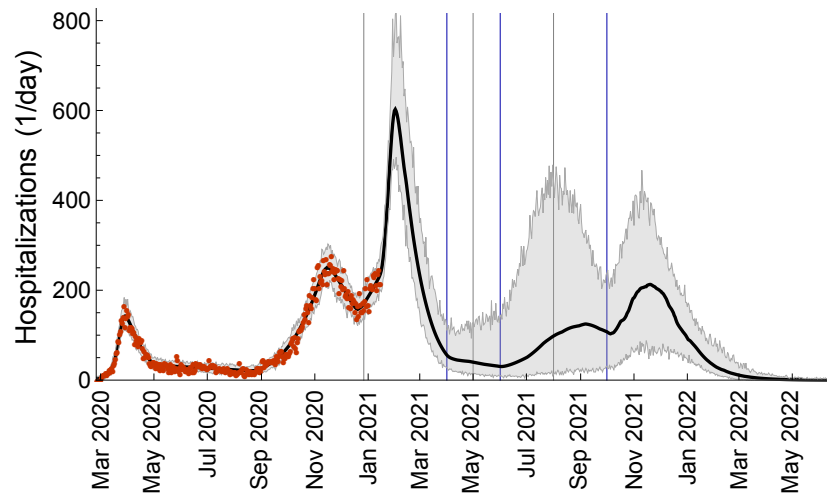
# Scenario 4: Different timing



# Scenario 4: Pessimistic assumptions



Decreased vaccine efficacy  
due to antigenic escape variants  
Zhou et al Cell 2021



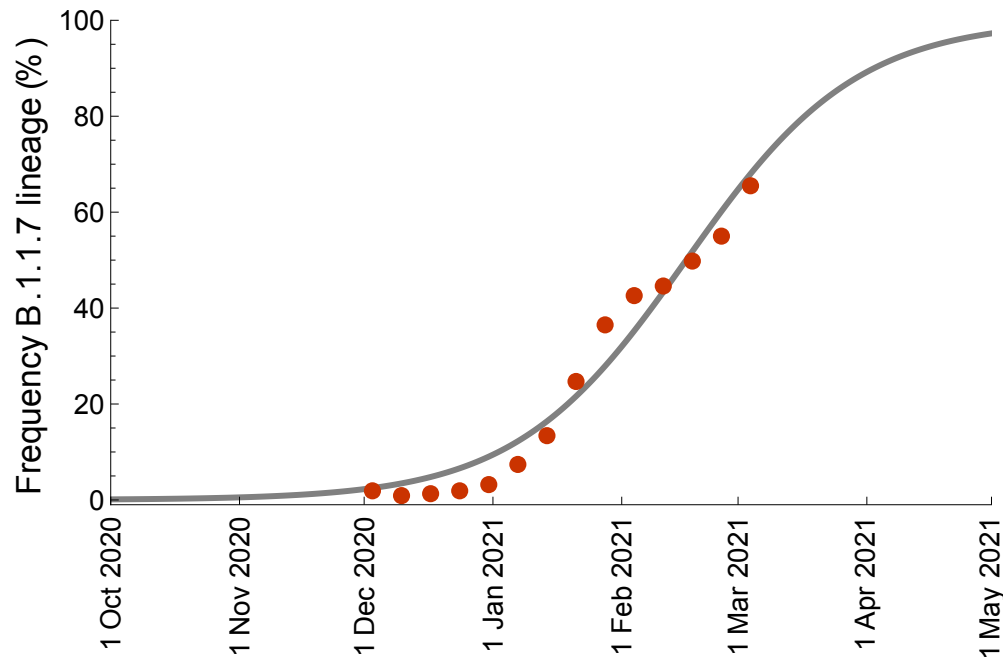
Decreased vaccine efficacy  
due to antigenic escape variants

+

Pre-pandemic contact rates in  
the vaccinated population

# Main limitations & work in progress

- Hospitalization data ends on 15 January 2021 (start of the third wave)
- No reinfection after natural infection/vaccination ([Saad-Roy et al Science 2021](#); [Levine et al Science 2021](#))
- No seasonality ([Kissler et al Science 2021](#))
- No estimation of selective advantage of B.1.1.7





# Conclusion

- Quick relaxation might lead to new waves in 2021
- Substantial measures prove necessary throughout 2021
- More favorable scenarios are relaxation of measures as in summer 2020 or a gradual relaxation until the end of 2021
- Another option would be increasing vaccination rates but this scenario does not seem to be feasible for Portugal



**Thank you!**

