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Shared work with Lena Plötzke. Hannah Tritzschak and Martin J. Kühn

### An extension of age-of-infection models: A SECIR model based on integro-differential equations for epidemic outbreaks

3RD (INTER-) NATIONAL CONFERENCE ON INFECTIOUS DISEASE MODELING









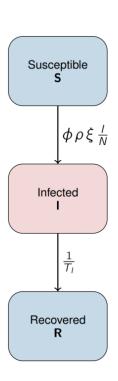
## Ordinary-differential equation (ODE) based model

$$S'(t) = -\frac{S(t)}{N} \phi(t) \rho(t) \xi(t) I(t)$$

$$I'(t) = \frac{S(t)}{N} \phi(t) \rho(t) \xi(t) I(t) - \frac{1}{T_{I}} I(t)$$

$$R'(t) = \frac{1}{T_{I}} I(t)$$

$\phi(t)$	Number of contacts at time t
$\rho(t)$	Transmission probability at time t
$\xi(t)$	Proportion of infected individuals that are not isolated at time $t$
$T_{I}$	Mean stay time in compartment <i>I</i>



for Severe Infectious Diseases







- Simple ODE models are restricted to exponentially distributed stay times in compartments
  - But: unrealistic assumption<sup>1,2</sup>
- Choice of transition distributions impacts disease dynamics; in particular at change points
- > Need for **flexible** choice of transition distributions
- > Use model based on integro-differential equations (IDE)

Wearing et al., Appropriate Models for the Management of Infectious Diseases, 2005. https://doi.org/10.1371/journal.pmed.0020174 <sup>2</sup> d'Onofrio, Mixed pulse vaccination strategy in epidemic model with realistically distributed infectious and latent times, 2004. https://doi.org/10.1016/S0096-3003(03)00331-X



Individuals that are still infected and not isolated at time t





### IDE-SIR model

$$S'(t) = -\frac{S(t)}{N} \phi(t) \rho(t) \int_{-\infty}^{t} \xi(t, t - x) \underbrace{\gamma_I^R(t - x)}_{\text{Individuals that are still infected at time } t}^{\text{New infections at time } x} \, \mathrm{d}x$$

$\sigma_S^I(\mathbf{x})$	Number of individuals transitioning from $S$ to $I$ at time $x$
$\gamma_I^R( au)$	Mean proportion of individuals that are still infected at infection age $ au$
$\xi(t,\tau)$	Proportion of infected individuals that are not isolated at time $t$ and infection age $ au$
$\rho(t)$	Transmission probability at time t
$\phi(t)$	Number of contacts at time t





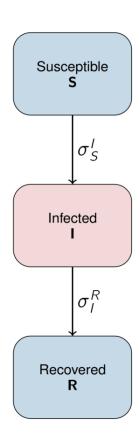


### IDF-SIR model

$$S'(t) = -\frac{S(t)}{N} \phi(t) \rho(t) \int_{-\infty}^{t} \xi(t, t - x) \gamma_{I}^{R}(t - x) \sigma_{S}^{I}(x) dx$$

$$I(t) = \int_{-\infty}^{t} \gamma_{I}^{R}(t - x) \, \sigma_{S}^{I}(x) \, dx$$

$$R(t) = \int_{-\infty}^{t} \left(1 - \gamma_{l}^{R}(t - x)\right) \sigma_{S}^{l}(x) dx$$









### IDE-SIR model

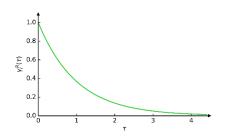
$$S'(t) = -\frac{S(t)}{N} \phi(t) \rho(t) \int_{-\infty}^{t} \xi(t, t - x) \gamma_{I}^{R}(t - x) \sigma_{S}^{I}(x) dx$$

$$I(t) = \int_{-\infty}^{t} \gamma_{I}^{R}(t - x) \sigma_{S}^{I}(x) dx$$

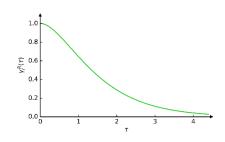
$$R(t) = \int_{-\infty}^{t} (1 - \gamma_{I}^{R}(t - x)) \sigma_{S}^{I}(x) dx$$

#### Flexible choice of transition distributions:

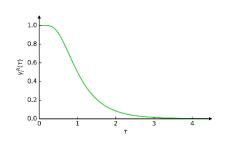
#### Exponential



Gamma



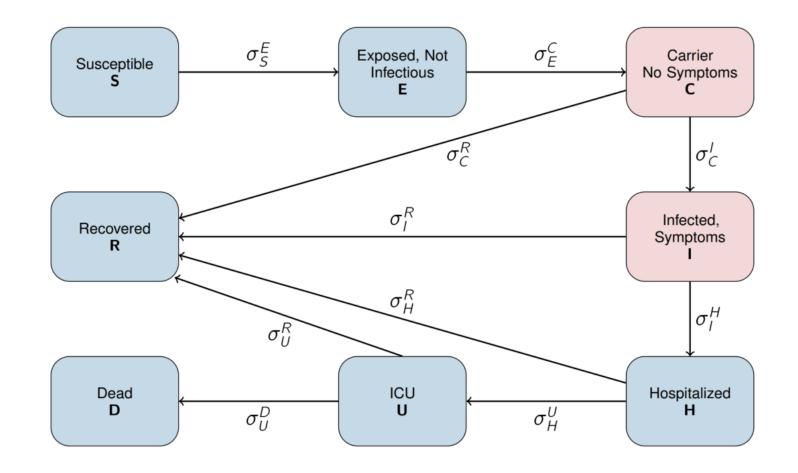
Lognormal







## Extension to IDE-SECIR model





## Numerical scheme preserves biological properties

- Extension of nonstandard numerical scheme<sup>3</sup> that preserves important biological properties:
  - Scheme is mass conserving

$$\hat{S}(t_n) + \hat{E}(t_n) + \hat{C}(t_n) + \hat{I}(t_n) + \hat{H}(t_n) + \hat{U}(t_n) + \hat{R}(t_n) + \hat{D}(t_n) = N.$$

• Susceptible compartment is monotonically decreasing and converges to some final size

$$\lim_{n\to\infty} \hat{S}(t_n) = \hat{S}_{\infty}(\Delta t).$$

Recovered and Dead compartments are monotonically increasing and converge

$$\lim_{n\to\infty} \widehat{R}(t_n) = \widehat{R}_{\infty}(\Delta t), \qquad \qquad \lim_{n\to\infty} \widehat{D}(t_n) = \widehat{D}_{\infty}(\Delta t).$$

Flows converge to 0

$$\lim_{n\to\infty} \hat{\sigma}_{z_1}^{z_2}(t_n) = 0.$$

<sup>&</sup>lt;sup>3</sup> Messina et al., A non-standard numerical scheme for an age-of-infection epidemic model, 2022. https://doi.org/10.3934/jcd.2021029

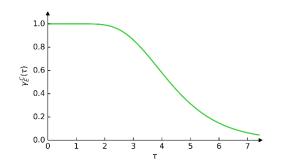


## Numerical comparison of IDE and ODE models

Assess impact of distribution by comparing IDE-SECIR model with a corresponding ODE model:

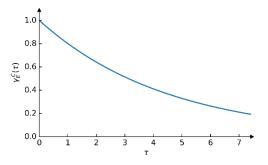
#### IDE model:

 Use lognormal distributions according to data on COVID-19<sup>4</sup>



#### ODE model:

• Use **exponential distributions** with corresponding mean stay times

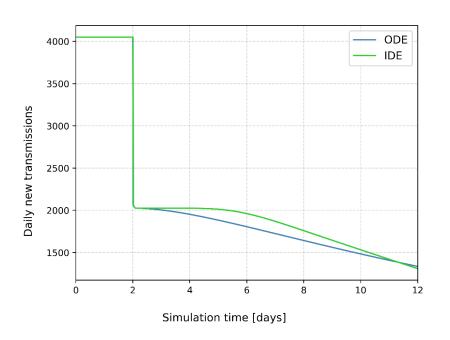


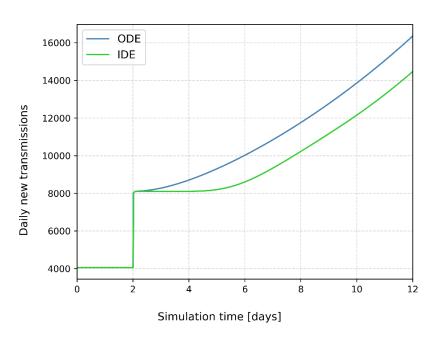
<sup>&</sup>lt;sup>4</sup> Kerr et al., Covasim: An agent-based model of COVID-19 dynamics and interventions, 2021. <a href="https://doi.org/10.1371/journal.pcbi.1009149">https://doi.org/10.1371/journal.pcbi.1009149</a>

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## Behavior at change points

IDE model reacts slower to change in contact rate than ODE model, agreeing with literature <sup>5,6</sup>

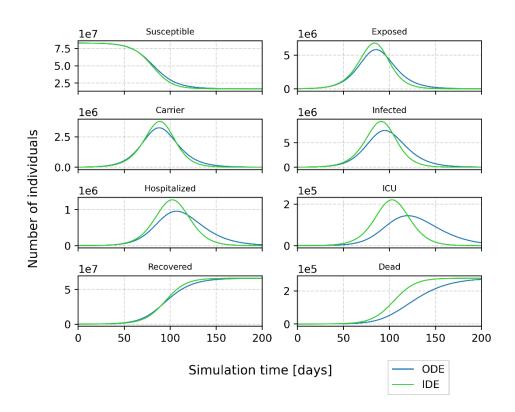




<sup>&</sup>lt;sup>5</sup> Dey et al., Lag time between state-level policy interventions and change points in COVID-19 outcomes in the United States, 2021. <a href="https://doi.org/10.1016/j.patter.2021.100306">https://doi.org/10.1016/j.patter.2021.100306</a>
<sup>6</sup> Guglielmi et al., Identification of time delays in COVID-19 data, 2023. <a href="https://doi.org/10.1515/em-2022-0117">https://doi.org/10.1016/j.patter.2021.100306</a>



# Epidemic peak behavior



- Higher epidemic peak in IDE model
- Different timings of peak
- Same final size for both models

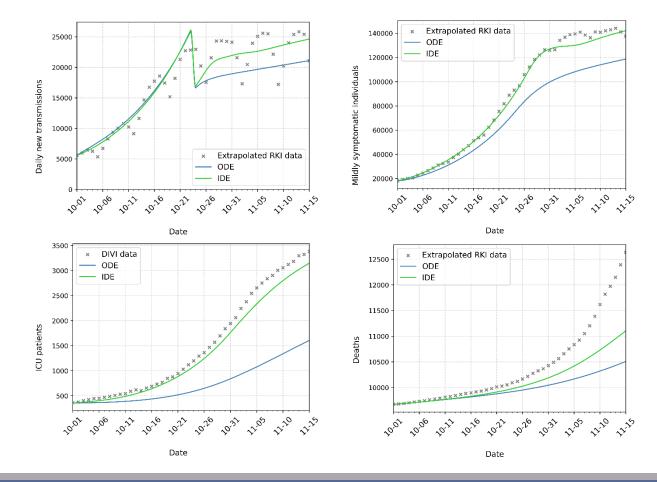








# COVID-19 inspired scenario





### Conclusion

- Using IDE model allows flexible choice of transition distributions
- Extended solver that preserves important biological properties
- Choice of distributions has significant impact on disease dynamics









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