

Simulation of non-pharmaceutical interventions in an agent based epidemic model

Petra Vidnerová, et al.

ÚI AV ČR & BISOP



ITAT 2021, September, Slovakia



BISOP CREW

- ▶ Luděk Berec, PRF JCU
- ▶ Tomáš Diviák, Manchester Uni.
- ▶ Aleš Kuběna, ÚTIA AV ČR
- ▶ René Levínský, CERGE-EI
- ▶ Roman Neruda, ÚI AV ČR
- ▶ Josef Šlerka, FP CUNI
- ▶ Martin Šmíd, ÚTIA AV ČR
- ▶ Gabriela Suchopárová, ÚI AV ČR
- ▶ Jan Trnka, 3FM CUNI
- ▶ Vít Tuček, Zagreb Uni.
- ▶ Petra Vidnerová, ÚI AV ČR
- ▶ Karel Vrbenský, ÚTIA AV ČR
- ▶ Milan Zajíček, ÚTIA AV ČR
- ▶ and others



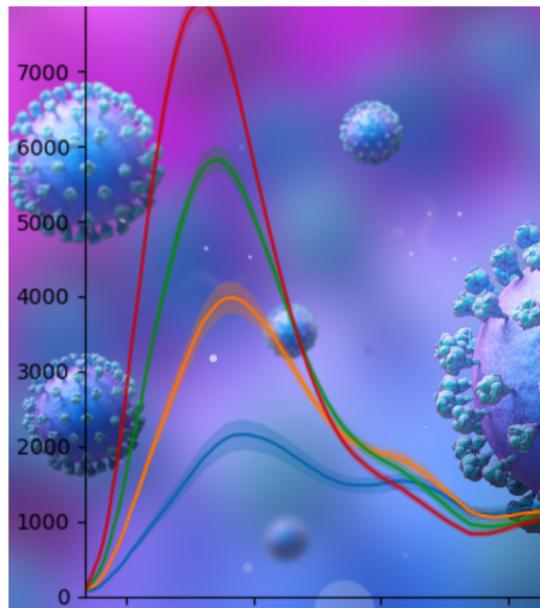
www.bisop.cz

Data from PAQ and MEDIAN.



Contents

- ▶ Introduction
- ▶ Model M
- ▶ Simulation of interventions
- ▶ Examples of experiments
- ▶ Conclusion



Introduction



Modelling

- ▶ Modelling is an important tool in epidemic control
- ▶ Non-pharmaceutical interventions slow down the spread of a virus
- ▶ Models has to reflect the interventions valid at the moment

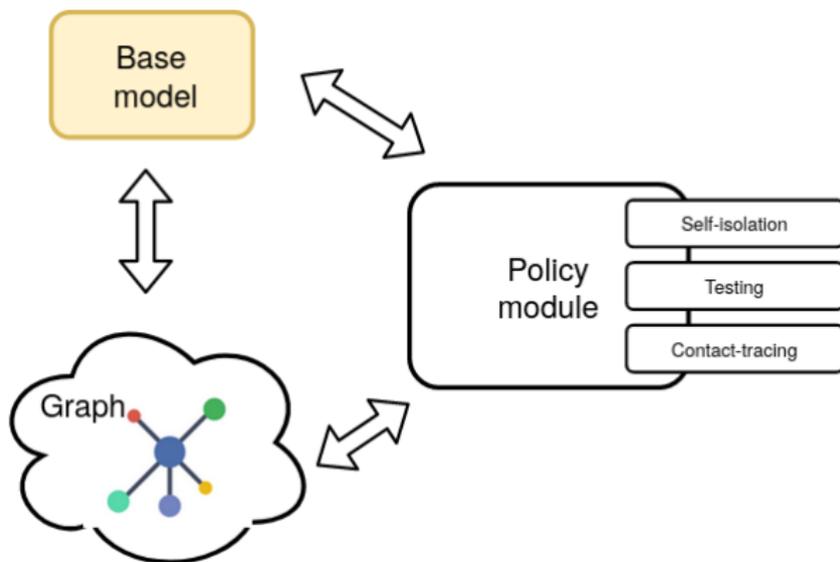
Interventions

- ▶ Protective measures - masks, hygiene, distancing, cautiousness
- ▶ Contact restrictions
 - ▶ Flat closures - closed schools, pubs, shops, etc.
 - ▶ Individual - isolation, quarantine



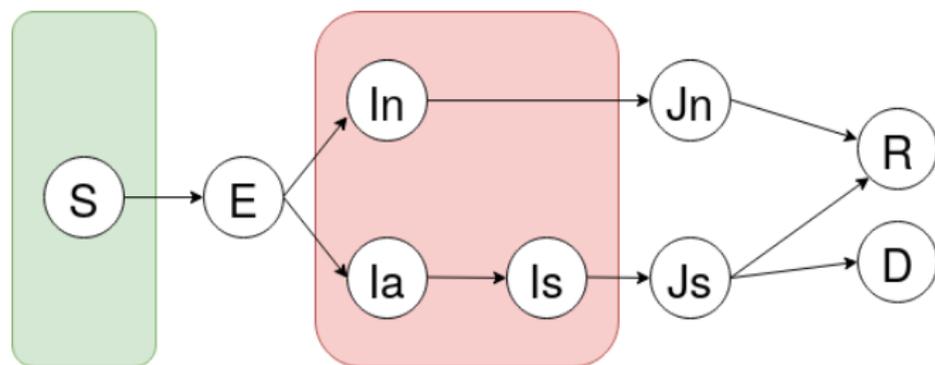
Model M

- ▶ Agent based model
- ▶ Uses a realistic contact graph
- ▶ Focus on comparing interventions (not on precise forecasting)



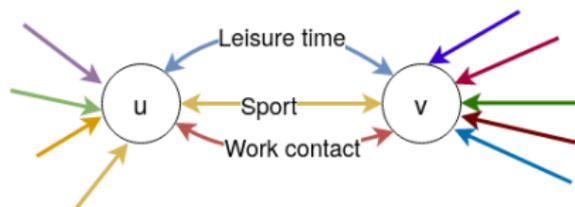
Model M - SEIR model

- ▶ Works with population of individuals
- ▶ Each individual is in exactly one of possible states
- ▶ Iterates on daily basis
- ▶ Transition $S \rightarrow E$ is given by β and contact graph
- ▶ Other transitions depends on parameters of the infection only



Model M - graph

- ▶ Model of a real Czech county
- ▶ Multi-graph
- ▶ Edges organised in layers
- ▶ Edges parameters: contact probability p , intensity i a layer type l
- ▶ Each day an edge is activated with probability $w_l * p$ (w_l layer weight)
- ▶ Probability of infection transmission

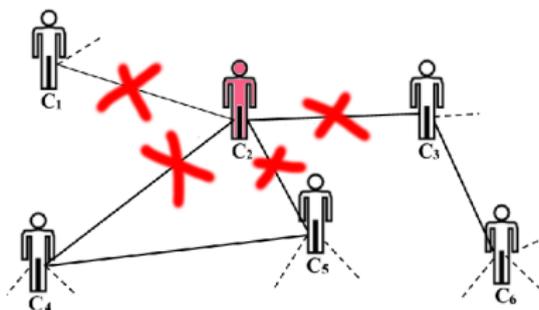


$$p_{S \rightarrow E}(e) = \begin{cases} \beta * i & \text{if the edge is active} \\ 0 & \text{otherwise} \end{cases}$$



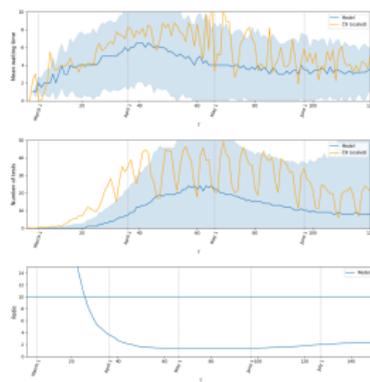
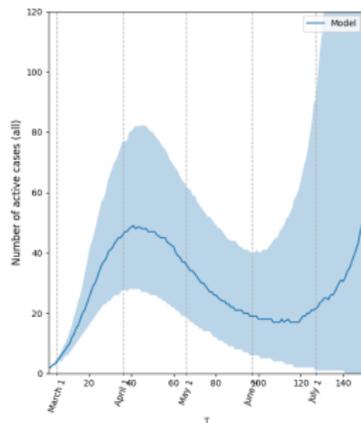
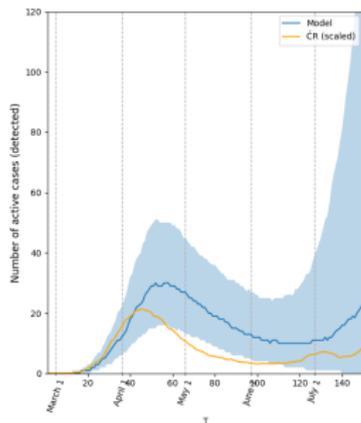
Model M - policy module

- ▶ Implements various interventions
- ▶ Controls and change model parameters
- ▶ Protective measures – reduction of β
- ▶ Flat contact restrictions
 - ▶ Switching off whole layers
- ▶ Individual isolation
 - ▶ Testing, self-isolation – individuals with symptoms
 - ▶ Contact tracing – different levels of contact tracing (family, school & work, leisure time, others)



Examples of experiments

Calibration



- ▶ Finding parameters to fit the history
- ▶ Using grid search and CMA-ES



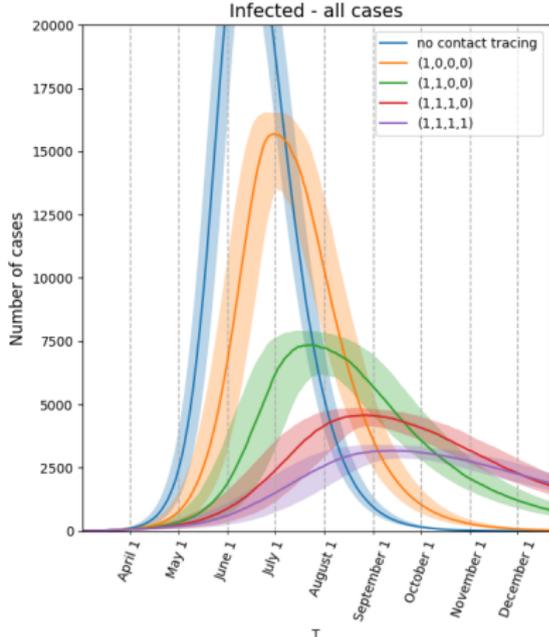
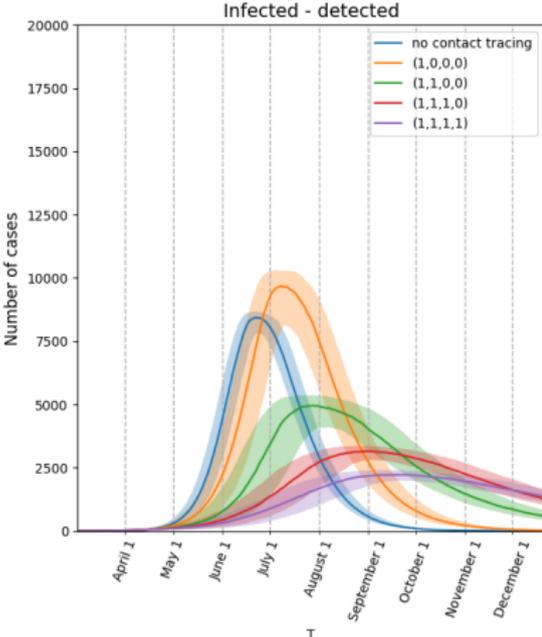
Examples of experiments

Experiment I

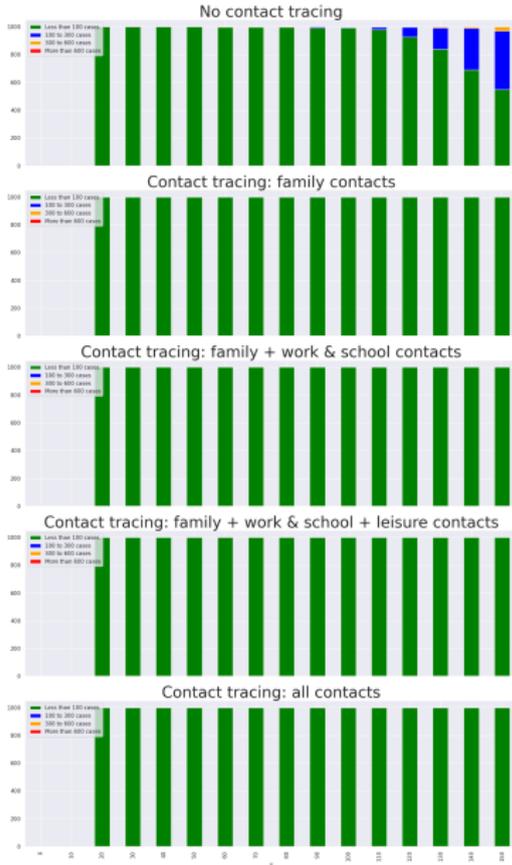
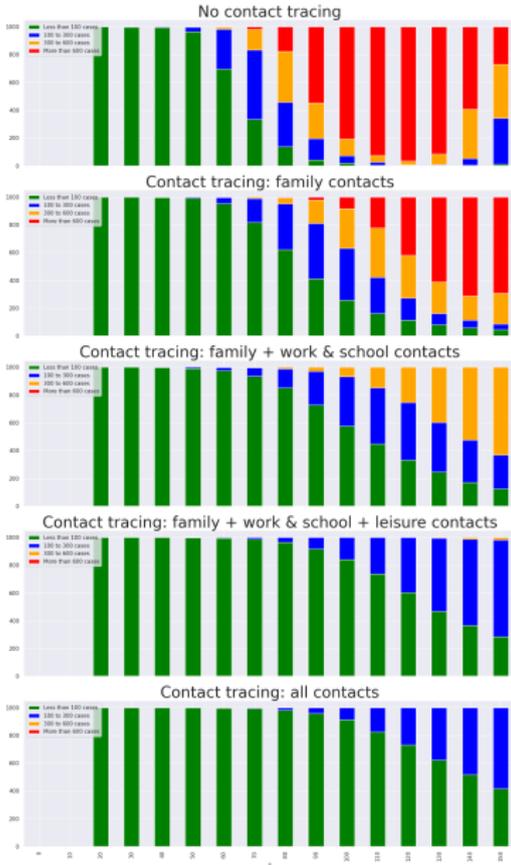
- ▶ Compare different levels of contact tracing – layers (family, school & work, leisure time, others)
- ▶ Two scenarios – with and without flat restrictions
- ▶ Flat restrictions corresponds to spring 2020 in the Czech Republic
- ▶ 1000 simulations for each setup (model is stochastic)
- ▶ Plotting medians and interquantile ranges



Different levels of contact tracing comparison



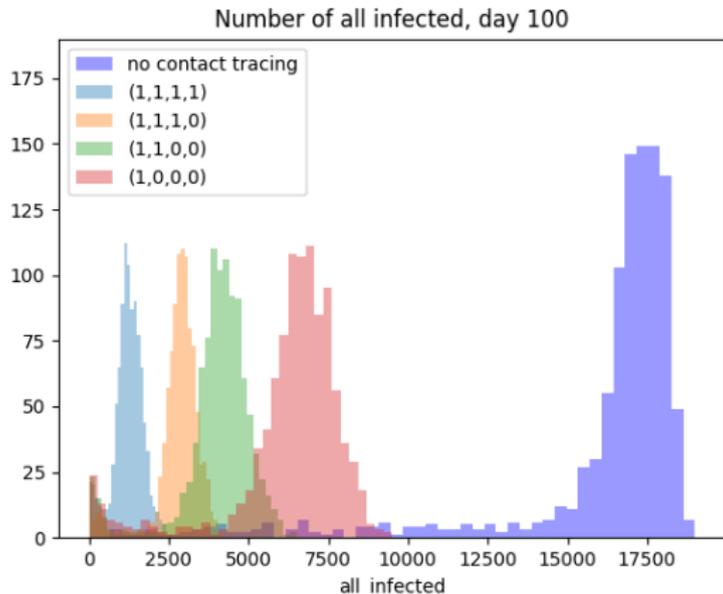
Distribution of individual simulation runs by epidemic level



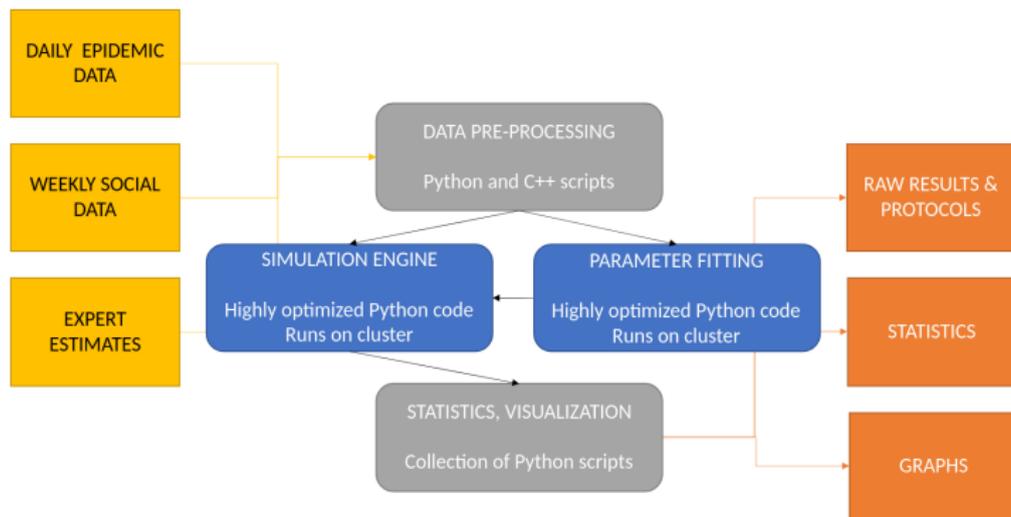
Histogram of simulation runs – scenario with a mass event

Experiment II

- ▶ A mass event
- ▶ Once a week
- ▶ 300 individuals
- ▶ 14 000 edges



Software



github.com/epicity-cz/model-m

(Release v1.0 available on September 30.)



Conclusion

Summary

- ▶ Agent based epidemic model with a realistic graph
- ▶ Enables simulation of various interventions
- ▶ High number of parameters – difficult to fit
- ▶ Modular and extendable (different graphs, vaccination, etc.)

Future work

- ▶ Export nodes (outside epidemic)
- ▶ Comparisons of simulations with our graph and with synthetic population

Thank you! Questions?

