# Járványok matematikai modellezése és ennek szerepe a döntéselőkészítésben

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### Innovative research: tracking social contact dynamics



- Co-Mix: The CoMix survey in Hungary has had 9 waves of data collection covering the period between 25 May 2021 and 14 September 2021.
- MASZK Magyar Adatszolgáltató Kérdőív (<u>http://koronaviruskutatas.sed.hu</u>), University of Szeged
  - Started from March 23, 2020, still ongoing
  - online questionnaire (<u>http://covid.sed.hu</u>), and mobile application
  - collected data from more than 250 000 people (possibly the largest number ever)
  - to correct non-representativity, complemented with monthly phone surveys on a representative sample of 1000-1500 people, 17 waves so far





Collected data on:

- Social mixing patterns in detailed breakdown
- COVID-19 history
- Testing experiences
- Mobility
- International travel
- Mask compliance
- Vaccination attitudes by vaccine types (extremely interesting due to Hungary's special vaccine portfolio)
- Trust
- Conspiracy theories
- etc.







#### Examples: critical contacts, mobility, vaccine attitudes





Online questionnaire + monthly representative surveys Lots of new features incorporated:

- Travels
- Mask compliance
- Vaccination attitudes
- Who people trust
- Prevalence of false information etc.

Huge dataset collected, many ongoing analysis



Vaccinated Would take at least one type of vaccine immediately Unsure Would not take any types of vaccine



**Figure 3.** Effective reproduction rates between 1st April 2020 and 31st December 2020 in Hungary estimated from the daily contact matrices of the online survey (black), and from the case numbers using the Cori method (grey) [cite Ferenci]. The grey area indicates the statistical confidence interval of the reference  $R_t$  estimation. Red dashed line shows the  $R_t = 1$  critical reproduction rate. Colored stripe below the horizontal axis shows the test positivity rate as a percentage of positive tests of all tests taken in the country on the given day. Annotated boxes show periods where methods based on case numbers either overestimate (red) or underestimate (blue) the reproduction rate, and where the method has a lot of uncertainty due to very low case numbers (yellow).

## Agent based modelling: building a virtual city

- Virtual Szeged developed by a team at Pázmány University
- 185 000 agents (citizens and commuters)
- Realistic, high resolution spatial demography
- Over 3000 locations (schools, workplaces, hospitals, etc.)
- Daily routines
- 10 minutes temporal resolution
- Disease dynamics
- Control measures
- High flexibility to include any feature















### Microsimulation based quantitative analysis of COVID-19 management strategies

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#### Short title

Pandemics management analysis by microsimulations

## Role of mathematical modelling in informing decision making

- We can not experiment with epidemics
- We must rely on mathematical models to analyse possible scenarios
- Models are useful:
  - to think and talk rigorously about the epidemics in quantitative terms
  - to explain what is going on
  - to make forecasts
  - to highlight complexity/simplicity
  - to understand trade-offs
  - to guide data collection
  - to evaluate past and future inverventions
  - to expand the evidence basis for informed decision making
- Models can be just as good as the data and information they rely on
- We need enhanced epidemiological surveillance: reliable, accurate, detailed, targeted data collection in real time
- We need some understanding of societal behaviour, triggers, reactions
- Without these, modelling is futile



A key figure from a highest level meeting in early November 2020

# Second wave (Fall 2020)



exponential growth corresponds to R=1.31



Hospitalizations



## Major predictions resulting from mathematical epidemiology

- First wave: contact numbers should be reduced by at least 60% to suppress the outbreak (we verified that it happened)
- We reported first that suppression was successful
- We stated that upon relaxing the measures, we can expect a second wave
- We warned first of the coming large outbreak in August 2020
- We predicted that the number of deaths will increase in October
- November interventions used our modelling input and predictions
- We predicted the third wave in early January (by alpha variant)
- In the most critical phase, hospitals were informed about the peak burden by our calculations
- March interventions were informed by our calculations
- We reported first the peak of the third wave
- Relaxation of measures in the Spring (school openings) used our calculations
- In June we predicted that there will be a fourth wave



# Huge economic impact of infectious disease outbreaks



https://www.preventionweb.net/blog/linking-health-environment-and-climate-reduce-disaster-risk

# Costs of the pandemic

#### • High death toll

- Healthcare systems under extreme pressure
- Normal healthcare services disrupted
- Long COVID
- Societal costs: disruption of education, mental issues, conflicts in society, issues of trust
- Some positive side effect: reduction in other respiratory viruses (no influenza), fewer accidents, less pollution.
- Economy: sector dependent impacts
- US: \$1.9 trillion COVID stimulus package
- EU: NextGenerationEU is a more than €800 billion temporary recovery instrument



#### **Corporate White Book**

Practical guide for the preparation and implementation of the corporate COVID-19 pandemic plan

Prepared by the Mathematical Modelling of Infectious Diseases and Epidemiological Analysis Task Force of the Hungarian Ministry for Innovation and Technology



availaible in English: https://vali.ifka.hu/medias/85/corporate\_white\_book.pdf Nonlinear Dyn (2020) 102:1965–1986 https://doi.org/10.1007/s11071-020-05980-1

#### FEATURE ARTICLE

## Nonlinear model predictive control with logic constraints for COVID-19 management

Tamás Péni · Balázs Csutak · Gábor Szederkényi · Gergely Rösto



#### Daily New Cases in Hungary



# Innovative technologies needs to be integrated into public health systems

- World was unprepared (crucial institutions have been downsized in past decade)
- Societal behaviours and attitudes are paramount (fighting infodemics)
- Monitoring new virus variants is essential
- Comprehensive strategies are best
- Paradigm change is needed for 21st century pandemic preparedness, innovation and modern technologies surveillance and analysis (WHO, USA recognized this)





By Lev Facher y Sept. 3, 2021

#### World Health | HUB

Reprints

Livestream up next:

Inauguration of the WHO Hub for Pandemic and Epidemic Intelligence

Scheduled for 1 September 15:00 CEST

#### HEALTH

The White House wants \$65 billion for an 'Apollo'-style pandemic preparedness program

Scientific reports        © Deck for any of the size of epidemic outbreaks in the source and target regions – a COVID-19 lesson      Maria Vittoria Barbarossa @1,126, Norbert Bogya <sup>1</sup> , Attila Dénes <sup>0</sup> , Gergely Röst <sup>0</sup> ,			Article Early Phase of the COVID-19 Outh and Post-Lockdown Scenarios Gergely Röst <sup>1</sup> , Ferenc A. Bartha <sup>1,*</sup> , Norbert Bogya <sup>1</sup> , Péter Bo Tamás Ferenci <sup>2</sup> , Krisztina J. Horváth <sup>1</sup> , Attila Juhász <sup>1,3</sup> , Csilla Zeolt Vizi <sup>1</sup> and Beatrix Oroczi <sup>1</sup>				tbreak ii Boldog <sup>1</sup> , Attila Ila Nagy <sup>1,3</sup> , Ta	MC n Hungary n Dénes <sup>1</sup> , más Tekeli <sup>1</sup> ,	Fall 2021 Resurgence and COVID-19 Seroprevalence in Canada Modelling waning and boosting COVID-19 immunity in Canada A Canadian Immunization Research Network Study August 17, 2021 David W. Dick <sup>1</sup> , Lauren Childs <sup>2</sup> , Zhilan Feng <sup>3a,b</sup> , Jing Li <sup>4</sup> , Gergely Röst <sup>5</sup> , David L. Buckeridge <sup>6</sup> , Nick H Ogden <sup>7</sup> , Jane M Heffernan <sup>1</sup>
Journal of Clinical Medicine Article Risck Association of Novel Coronavi	Can hesitancy be mitigated by free choice across					cross	Different approaches to quantify years of life lost from COVID-19 Tamás Ferenci		
KISK ASSESSMENT OF NOVEL COFORAVI Outbreaks Outside China     Péter Boldog, Tamás Tekeli, Zsolt Vizi, Attila Dénes * <sup>®</sup> , Ferenc A     contrinus journal of social of collogit and social policy tol. II (20092, 199-146, doi: 10.1493/CSS9-200829	<b>COVID-19 vaccine types?</b> Kristóf Kutasi <sup>1</sup> , Júlia Koltai <sup>2,3,4</sup> , Ágnes Szabó-Morvai <sup>5,11</sup> , Gergely Péter Biró <sup>8,9,+,*</sup> , and Balázs Lengyel <sup>10,11,+,**</sup>				/ai <sup>5,11</sup> , Gerge	ely Röst <sup>6</sup> , N	lárton Karsai <sup>4,7</sup> ,	Adaptive group testing in a compartmental model of COVID-19	
Symptom-based testing model of COVID-19   HUNGARY IN MASKS/"MASZK" IN HUNGARY   Ferenc A. Bartha, János Karsai, Tamás   Mierors Karsai, Elitur Korra Mi Orson va Visioner va Pácet			npartmental		The shrinking families para COVID-19 Péter Boldog, Gergely Röst		radox and	Attila Dénes, Tamás Tekeli, Gergely Röst Monitoring behavioural responses during pandemie via reconstructed contact matrices from online and	
Nonlinear Dyn (2020) 102:1965–1986 https://doi.org/10.1007/s11071-020-05980-1	EPIDEMIC MODEL FOR RISK-BASED TESTING AND QUARANTINE					representative surveys Júlia Koltai <sup>1,2,3,+</sup> , Orsolya Vásárhelyi <sup>3,4,+</sup> , Gergely Röst <sup>5</sup> , and Márton Karsai <sup>3,6,+,*</sup>			
FEATURE ARTICLE     Nonlinear model predictive control with logic constraints for     COVID-19 management     Tamás Péni - Balázs Csutak - Gábor Szederkényi -		ROYAL SOC OPEN SCIEI	A DENES, G. ROST AND T. TEKELI Bolyai Institute, University of Szeged, OCIETY IENCE /publishing.org A hybrid PDE-, viral dynamics to SARS-CoV- influenza			odel for olication	<b>Vicrosimulation based evaluation of COVID-19 management strategies</b> (stván Z. Reguly <sup>1,2</sup> , Dávid Csercsik <sup>1</sup> , János Juhász <sup>1,3</sup> , Kálmán Tornai <sup>1</sup> , Zsófia Bujtár <sup>1</sup> , Gergely Horváth <sup>1</sup> , Bence Keömley-Horváth <sup>1,2</sup> , Tamás Kós <sup>1</sup> , György Cserey <sup>1</sup> , Kristóf Iván <sup>1</sup> , Sándor Pongor <sup>1</sup> Gábor Szederkényi <sup>1</sup> , Gergely Röst <sup>4</sup> , Attila Csikász-Nagy <sup>1,5</sup>		
Gergely Rösto PROPENSITY MATRIX METHOD FOR AGE DEPENDENT STOCHASTIC INFECTIOUS DISEASE MODELS*		Research <b>∂</b>	Image: State of the state o			bra Juhász,		Oroszi Beatrix, H	orváth J. Krisztina, Túri Gergő, Krisztalovics Katalin, Röst Gergely
P. BOLDOG, N. BOGYA <sup>†</sup> AND ZS. VIZI <sup>‡</sup> Modeling waning and boosting of COVID-19 in Car vaccination	BMJ Global Health	BMJ Global Health Unequal burden of COV Hungary: a geographical socioeconomic analysis o wave of the pandemic			19 in d 1e second	1	Az epidemiolo szerepe a pan	ógiai surveillance és járványmatematikai előrejelzések démiás hullámok megelőzésében, mérséklésében – hol tartunk most, és hová kellene eljutni miological surveillance and mathematical forecasting in preventing and	
Lauren Childs <sup>1</sup> , David W Dick <sup>2</sup> , Zhilan Feng <sup>3a,b</sup> , Jane M Heffernan <sup>2</sup> , Jing Li <sup>4</sup> , Gergely Röst <sup>5</sup>		E	Beatrix Oroszi, <sup>1</sup> Attila Juhász,² Csilla Nagy,² Judit Krisztina Horváth,¹ Martin McKee ☺ ,³ Róza Ádány <sup>4,5</sup>				mitigating pandemic waves – what has been accomplished and what should be achieved		