

A systems view on national well-being and implications of COVID-19 on it

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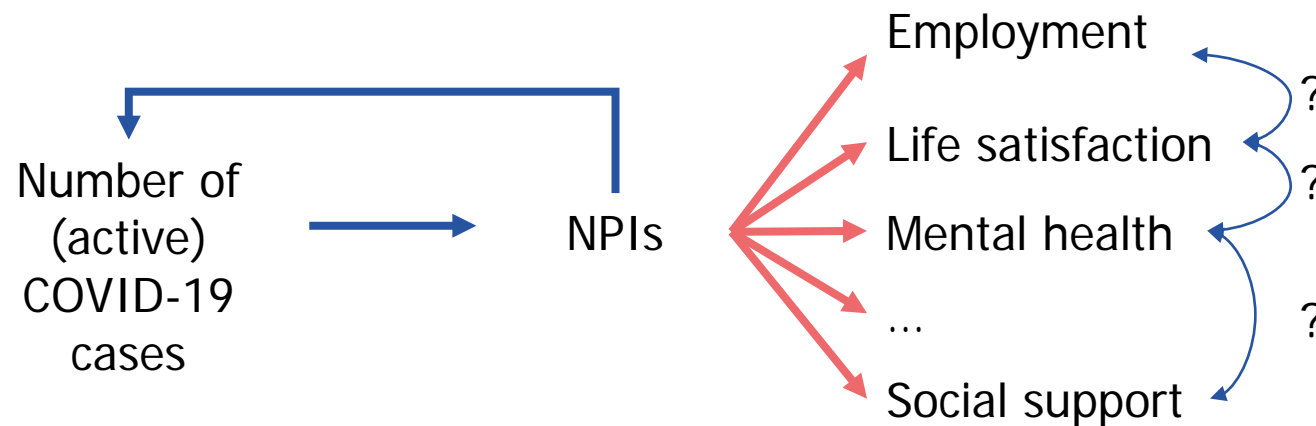
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National well-being – going beyond GDP

- **Well-being** refers to the state of feeling healthy and happy, or the state of being happy, healthy or prosperous (Merriam-Webster, 2019)
- The theoretical sociological literature also refers to **freedoms** (Sen 1993, Sen and Nussbaum 2005) and **capabilities** (Nussbaum 2011) when well-being is not only perceived as the attaining of pleasure, but as “the striving for perfection that represents the realization of one’s true potential”
- **Multidimensional frameworks**
 - *UN Human Development Index (HDI)* covers life expectancy and education level in addition to the GDP (UNDP, 2018)
 - *OECD Better Life Index* and *OECD Well-being Framework* combine a wide variety of indicators from economy to housing and health (OECD, 2020).
 - Also used by some countries, e.g., Bhutan, New Zealand, UK

Impact of COVID-19 policies on national well-being

- Economic consequences are often in the focus. However, other consequences such as health (including emotional), happiness, psychological effects have also been found to be substantial
- Generally perceived as negative, however, national well-being is a complex system



A complex system:

- Cannot be explained by breaking it down into components due to their strong interdependency
- Interdisciplinary in nature

Source: Cairney, 2012. Complexity Theory in Political Science and Public Policy, Political Studies Review, 10(3) 346-358

Systems thinking approach

- Systems thinking and holistic approach are needed to find effective nexus solutions and to reduce risks of unwanted consequences in complex systems

“COVID-19 means systems thinking is no longer optional”

Seth Reynolds, Principal Consultant, Systems Change: NPC

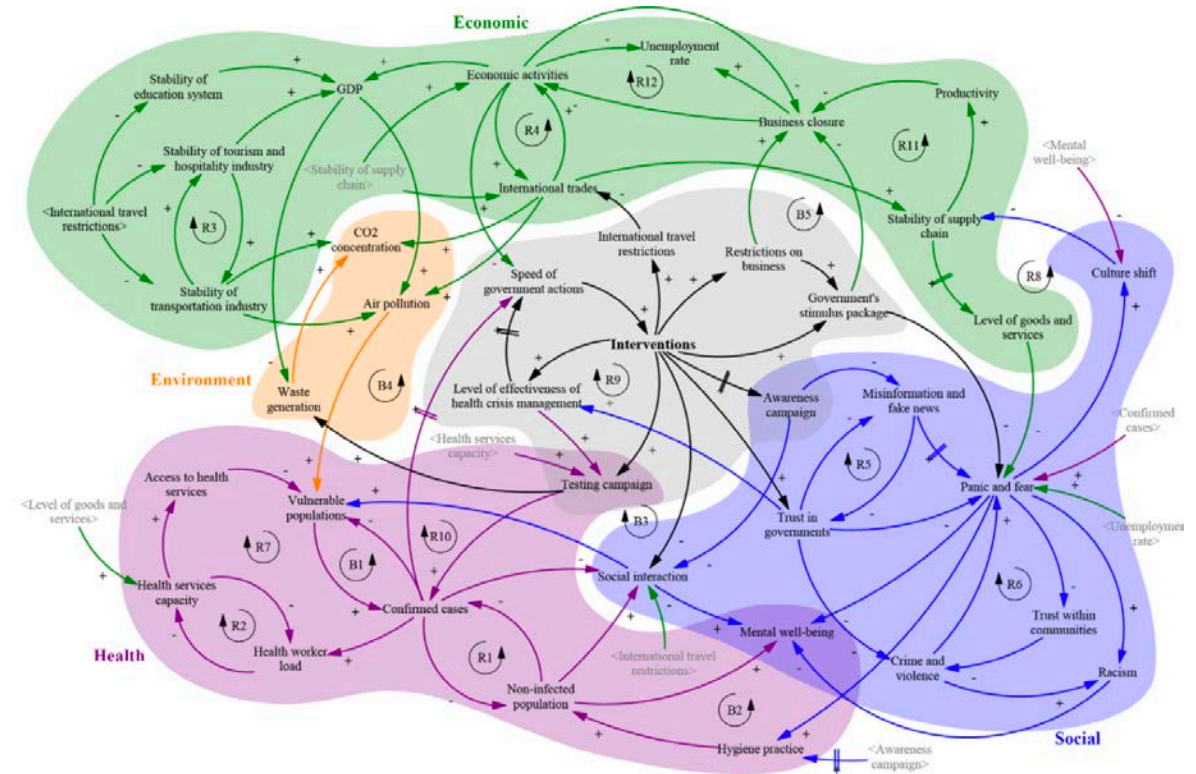
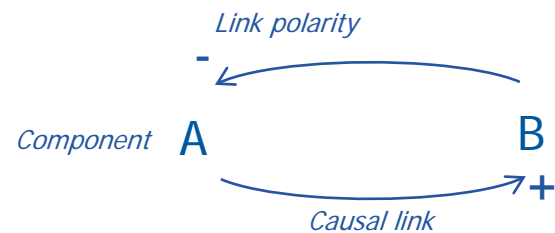
- Systems thinking is based on analyzing causal interconnections, indirect effects and feedback loops
- Decision makers can be assisted by formal tools of qualitative systems thinking, which can help reveal tradeoffs and synergies
- Formal tools can also help reduce “wickedness” of the problem and discipline a dialogue

Systems maps (causal loop diagrams)

A system map consists of **components** (elements, nodes) and directed links between components

A **link** represents a causal relation between two components. A link from A to B implies that if A changes, as a result B will change, too

A **link polarity** denotes the direction of the relationship between two components. A positive causality between A and B means that the change in B is in the same direction as A. A negative causality means that the change in B is in opposite direction



Source: Sahin, O.; Salim, H.; Suprun, E.; Richards, R.; MacAskill, S.; Heilgeist, S.; Rutherford, S.; Stewart, R.A.; Beal, C.D., 2020. Developing a Preliminary Causal Loop Diagram for Understanding the Wicked Complexity of the COVID-19 Pandemic. *Systems*, 8, 20, doi:10.3390/systems8020020.

Systems mapping has been rarely applied to national well-being issues, e.g., the PhD thesis of Forgie (2016) and contribution by Csutora et al. (2015)

National Well-being and COVID-19 policies system

System components

- National well-being system (31 components)
 - The OECD Well-being Framework
 - Complexity reduction:
 - Focus on current well-being indicators
 - Discarding some highly-correlated indicators
- COVID-19 policies (8 components)
 - Complexity Science Hub Vienna COVID-19 Control Strategies List (CCCSL): 48 policies clustered in 10 groups, 2 discarded

System links

- Collective assessment by six co-authors (169 links)
- Confirmation from empirical literature (85 sources)

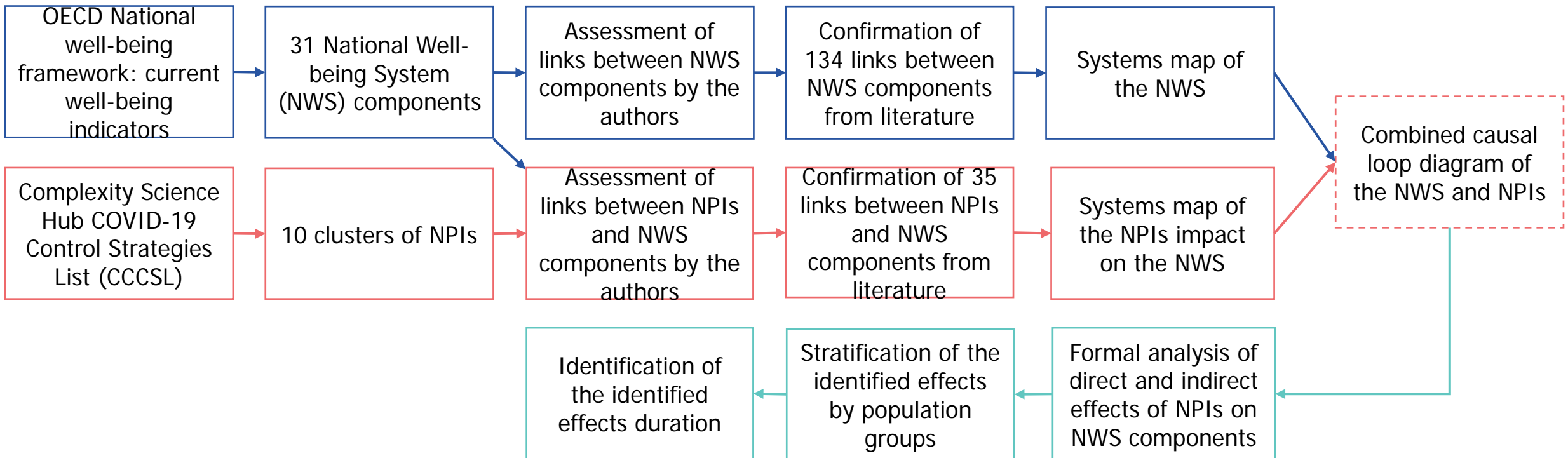


Source: OECD (2020), How's Life? 2020: Measuring Well-being, OECD Publishing, Paris

Policy Groups	Included in Analysis (+)
State of emergency	+
Medical capacity enhancement	+
International travel restrictions	+
Quarantines	+
Restrictions on population mobility	+
Enhancement of physical barriers	+
Gatherings restriction	+
Closures	+
Raising awareness	-
Government support	-

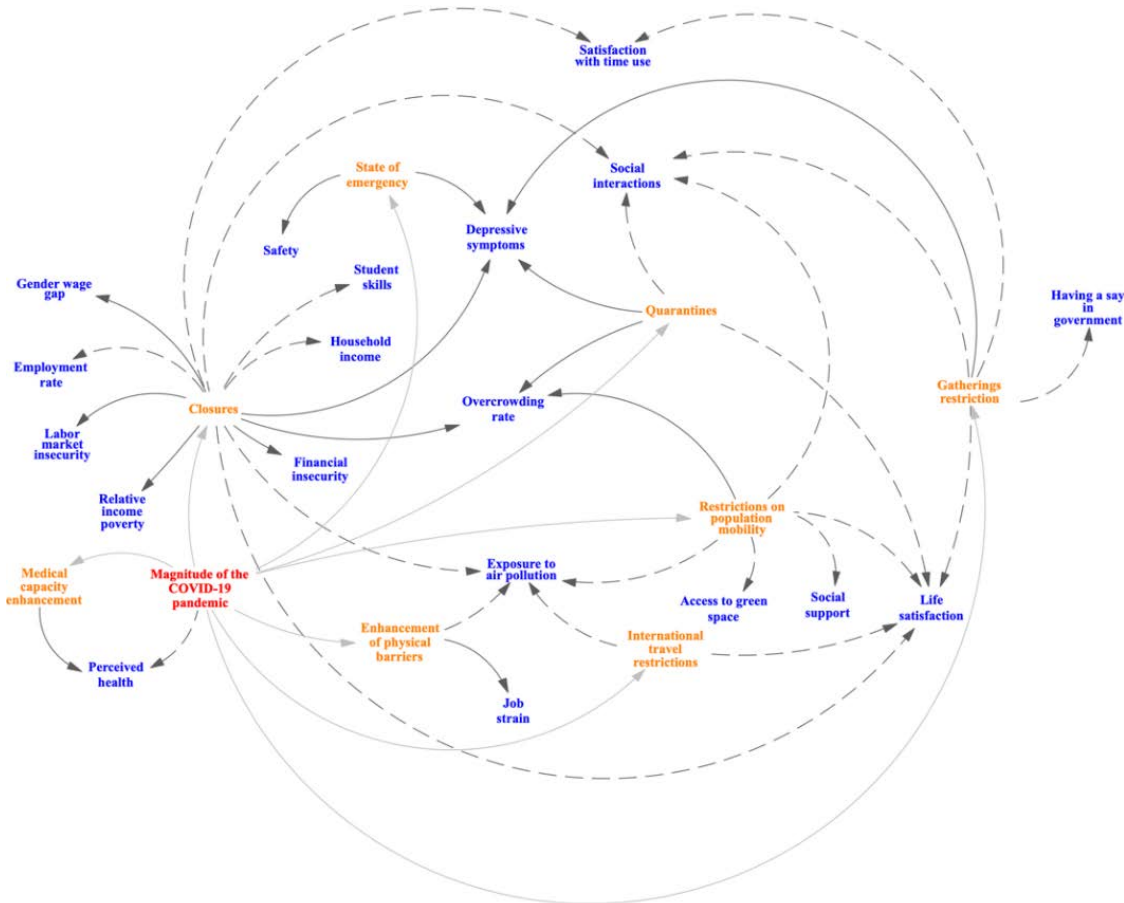
Source: Strelkovskii, N.; Rovenskaya, E.; Ilmola-Sheppard, L.; Bartmann, R.; Rein-Sapir, Y.; Feitelson, E. Implications of COVID-19 Mitigation Policies for National Well-Being: A Systems Perspective. *Sustainability* **2022**, *14*, 433. <https://doi.org/10.3390/su14010433>

Methodology overview

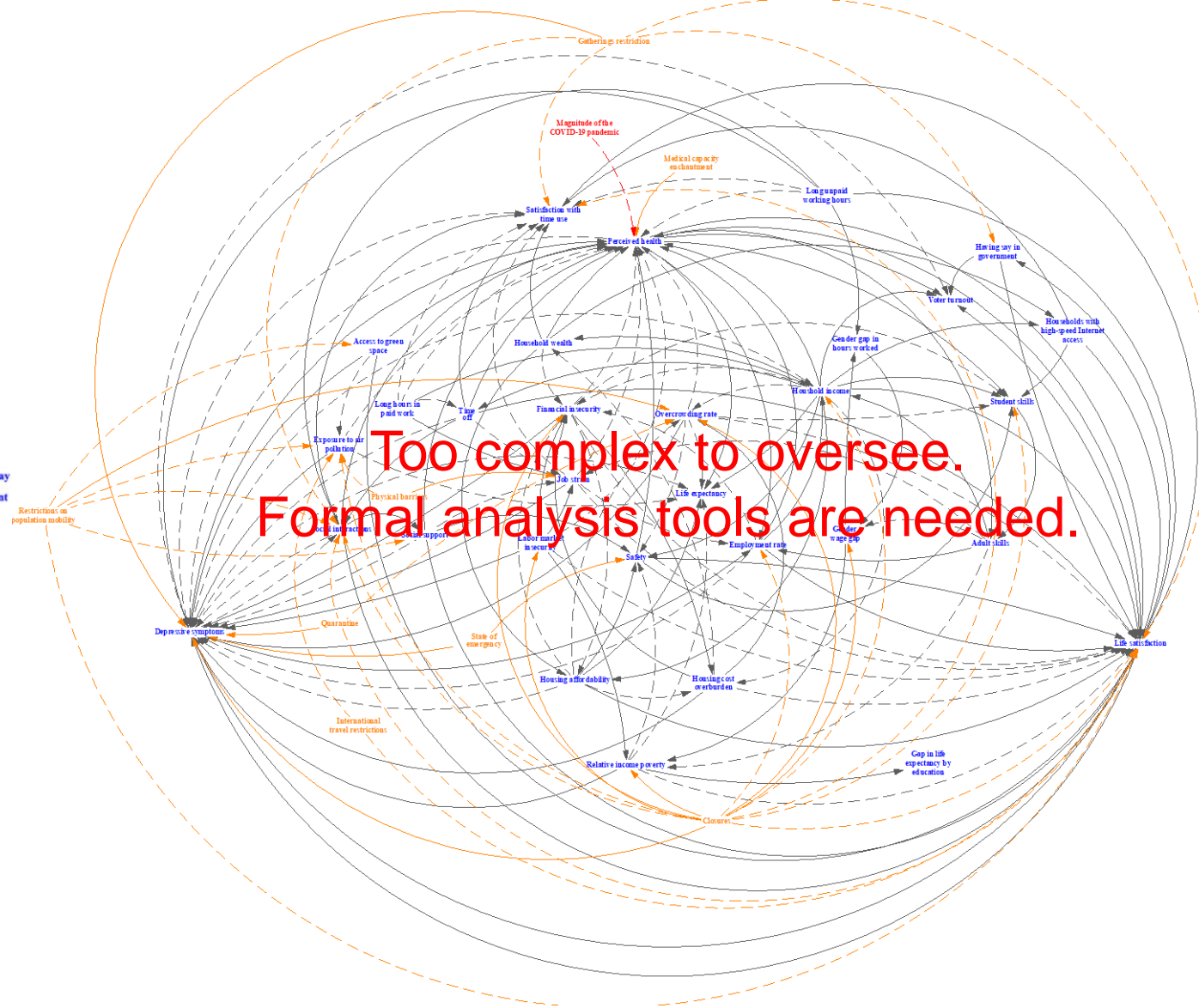


Source: Strelkovskii, N.; Rovenskaya, E.; Ilmola-Sheppard, L.; Bartmann, R.; Rein-Sapir, Y.; Feitelson, E. Implications of COVID-19 Mitigation Policies for National Well-Being: A Systems Perspective. *Sustainability* **2022**, *14*, 433. <https://doi.org/10.3390/su14010433>

Systems maps



Direct impact of the COVID-19 pandemic (red) and selected mitigation policies (orange) onto national well-being components (blue).

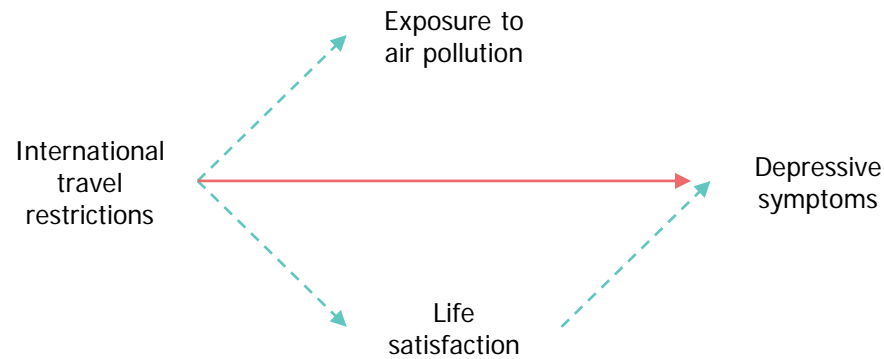


Systems map of the national well-being system (blue components) with direct effects of the COVID-19 pandemic (red component) and selected NPIs (orange components) included.

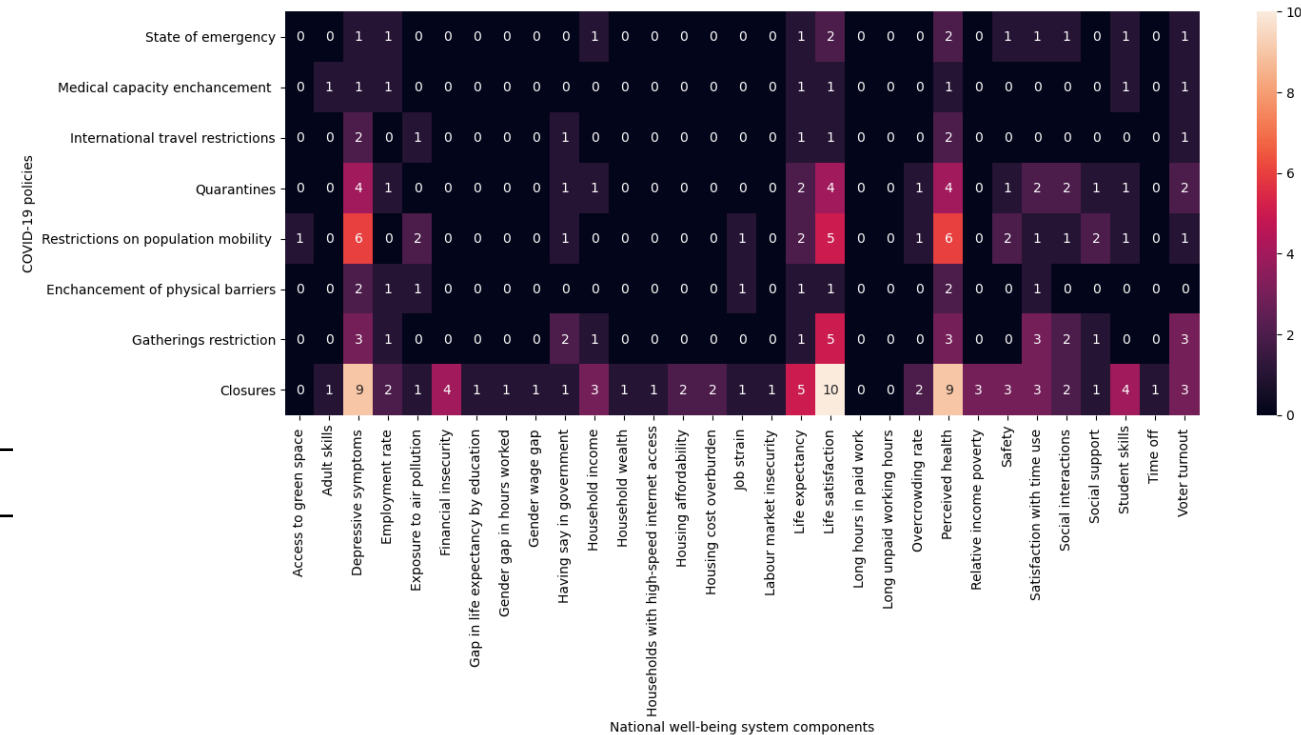
Source: Strelkovskii, N.; Rovenskaya, E.; Ilmola-Sheppard, L.; Bartmann, R.; Rein-Sapir, Y.; Feitelson, E. Implications of COVID-19 Mitigation Policies for National Well-Being: A Systems Perspective. *Sustainability* **2022**, *14*, 433. <https://doi.org/10.3390/su14010433>

Direct and indirect effects of COVID-19 policies

Impact through other national well-being and intervening components

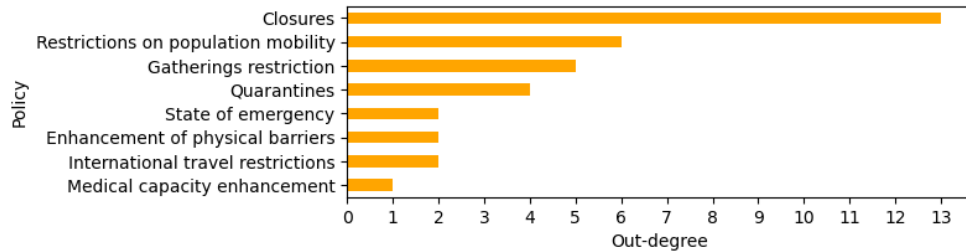


Total number of paths of length not greater than 2 (i.e., direct and first-order indirect effects) between COVID-19 policies (NPIs) & national well-being system components.

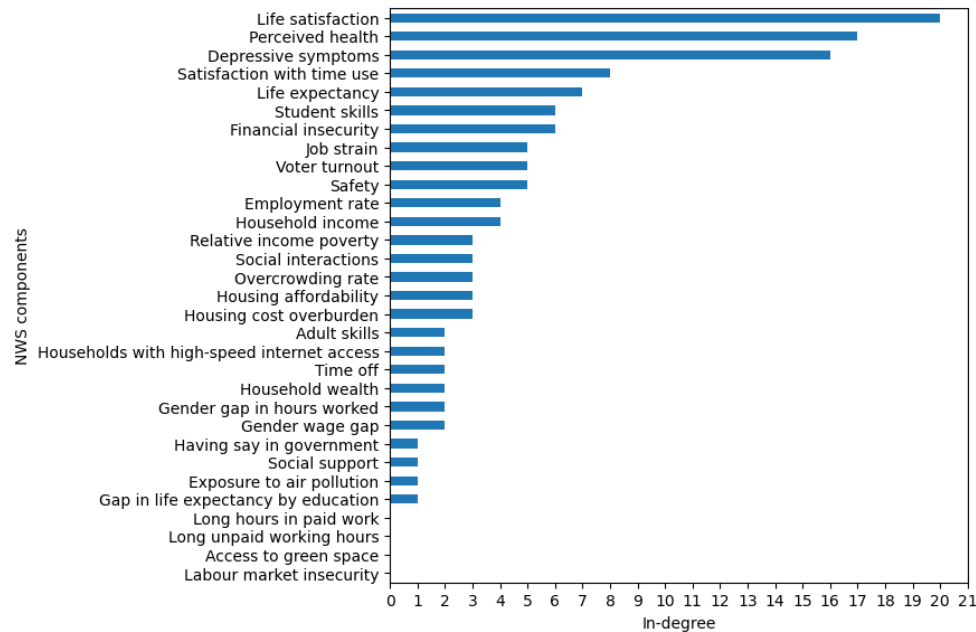


Mitigation Policy	Direct Effects	Indirect Effects	Total Effects	Indirect/Direct Ratio
State of emergency	2	11	13	5.5
Medical capacity enhancement	1	7	8	7
International travel restrictions	2	7	9	3.5
Quarantines	4	23	27	5.75
Restrictions on population mobility	6	27	33	4.5
Enhancement of physical barriers	2	8	10	4
Gatherings restriction	5	20	22	4
Closures	13	65	78	5

Direct and indirect effects of COVID-19 policies



Out-degrees of the selected COVID-19 mitigation policies.



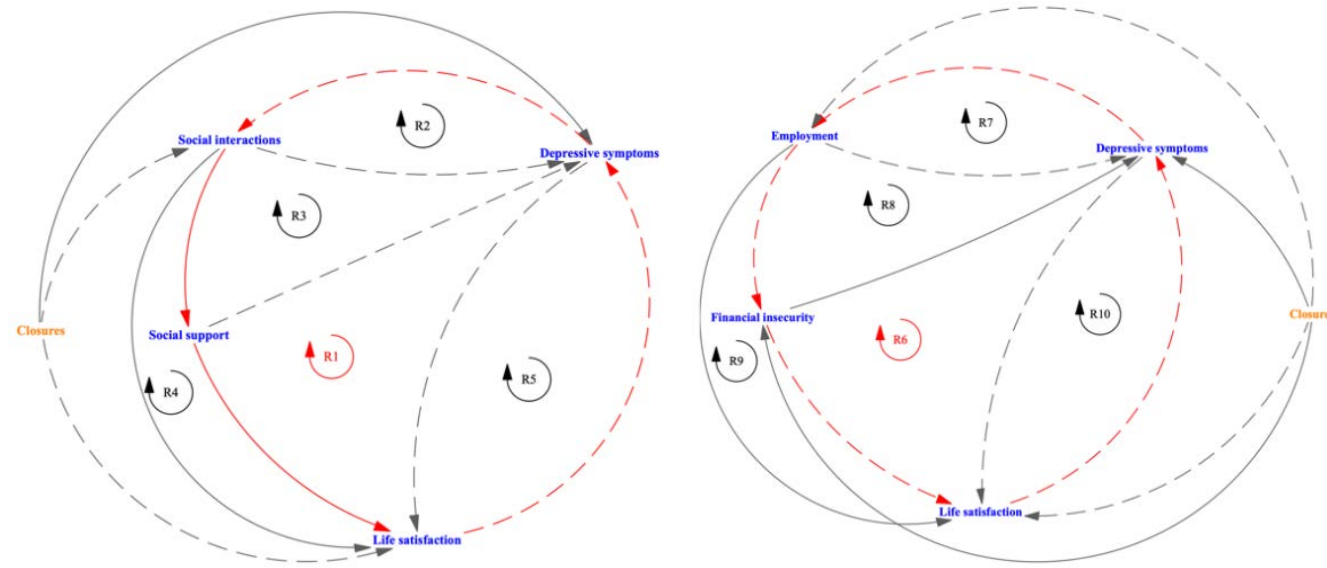
In-degrees of the National Well-being System components

Source: Strelkovskii, N.; Rovenskaya, E.; Ilmola-Sheppard, L.; Bartmann, R.; Rein-Sapir, Y.; Feitelson, E. Implications of COVID-19 Mitigation Policies for National Well-Being: A Systems Perspective. *Sustainability* **2022**, *14*, 433. <https://doi.org/10.3390/su14010433>

	Closures	Enhancement of Physical Barriers	Gatherings Restriction	International Travel Restrictions	Medical Capacity Enhancement	Quarantines	Restrictions on Population Mobility	State of Emergency
Access to green space	0	0	0	0	0	0	-1	0
Adult skills	-1	0	0	0	1	0	0	0
Depressive symptoms	?	?	1	?	-1	1	?	1
Employment rate	-1	-1	-1	0	1	-1	0	-1
Exposure to air pollution	-1	-1	0	-1	0	0	?	0
Financial insecurity	1	0	0	0	0	0	0	0
Gap in life expectancy by education	1	0	0	0	0	0	0	0
Gender gap in hours worked	-1	0	0	0	0	0	0	0
Gender wage gap	1	0	0	0	0	0	0	0
Having say in government	-1	0	-1	-1	0	-1	-1	0
Household income	-1	0	-1	0	0	-1	0	-1
Household wealth	-1	0	0	0	0	0	0	0
Households with high-speed internet access	-1	0	0	0	0	0	0	0
Housing affordability	-1	0	0	0	0	0	0	0
Housing cost overburden	1	0	0	0	0	0	0	0
Job strain	1	1	0	0	0	0	1	0
Labor market insecurity	1	0	0	0	0	0	0	0
Life expectancy	?	1	-1	1	1	-1	?	?
Life satisfaction	-1	-1	-1	-1	1	-1	-1	?
Long hours in paid work	0	0	0	0	0	0	0	0
Long unpaid working hours	0	0	0	0	0	0	0	0
Overcrowding rate	1	0	0	0	0	1	1	0
Perceived health	?	?	-1	?	1	-1	?	-1
Relative income poverty	1	0	0	0	0	0	0	0
Safety	-1	0	0	0	0	-1	-1	1
Satisfaction with time use	-1	-1	-1	0	0	-1	-1	-1
Social interactions	-1	0	-1	0	0	-1	-1	-1
Social support	-1	0	-1	0	0	-1	-1	0
Student skills	-1	0	0	0	1	-1	-1	1
Time off	-1	0	0	0	0	0	0	0
Voter turnout	-1	0	-1	-1	1	-1	-1	-1
1	Direct positive effect	-1	Direct negative effect	?	Ambiguous effects (direct + indirect)			
1	Indirect positive effect(s)	-1	Indirect negative effect(s)	?	Ambiguous effects (only indirect)			

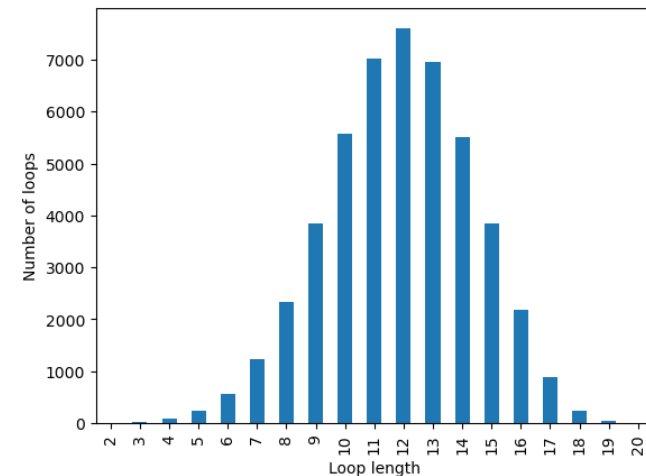
Feedback loops

- A **feedback loop** is a sequence of links connecting components by forming a cycle
- **Reinforcing** feedback loop – an initial increase/decrease of the state of any component further increases/decreases after every cycle
- **Balancing** feedback loop – an initial increase/decrease of the state of any component decreases/increases after every cycle.
- Identifying feedback loops is a **primary analysis method** of systems maps



“social driver of life satisfaction”

“economic driver of life satisfaction”



Number of feedback loops of different lengths in the National Well-being System. Loop length is the number of links it contains.

The Equity Effects of COVID-19 on Well-Being

- Group 1: Income and Employment Unaffected
- Group 2: Loss of Job Security and Possibly Some Income
- Group 3: Loss of Jobs

Well-Being Component	Duration of Effect	Group 1	Group 2	Group 3
Access to green space	s/m	–	–	–
Adult skills	l	0	0	(–) ***
Depressive symptoms	s/m/l	+	+	+
Employment rate	s	0	0	(–) ***
Exposure to air pollution	s/m/l	–	–	–
Financial insecurity	m/l	0	0/–	–
Gap in life expectancy by education	0	0	0	0
Gender gap in hours worked	s/m	(+) *	+	+
Gender wage gap	s/m	0	0	+
Having say in government	m/l	–	–	–
Household income	s	0	0/(–) **	–
Household wealth	m/l	0	0/–	–
Households with high-speed internet access	s	0 ****	0	0
Housing affordability	l	0	0	–
Housing cost overburden	l	0	0	+
Job strain	m/l	0	+	+
Labor market insecurity	s	0	+	+
Life expectancy	0	0	0	0
Life satisfaction	m/l	0	–	–
Long hours in paid work	0	0	0	0
Long unpaid working hours	s/m	(+) *	+	+
Overcrowding rate	s	+	+	+
Perceived health	s/m/l	–	–	–
Relative income poverty	s/m/l	0	0	+
Safety	s	0	0	–
Satisfaction with time use	s	–	–	–
Social interactions	s	–	–	–
Social support	s/m	–	–	–
Student skills	m/l	0	0	(–) ***
Time off	0	0	0	0
Voter turnout	m/l	–	–	–

* In cases where needed childcare was affected; ** Depending on the extent to which income affected; *** Affecting mainly those who are dependent on public transport; **** While this well-being component is not affected by the COVID-19 mitigation policies, it has been observed that the number of households with high-speed Internet access has increased to facilitate, among other things, remote work.

Source: Strelkovskii, N.; Rovenskaya, E.; Ilmola-Sheppard, L.; Bartmann, R.; Rein-Sapir, Y.; Feitelson, E. Implications of COVID-19 Mitigation Policies for National Well-Being: A Systems Perspective. *Sustainability* **2022**, *14*, 433. <https://doi.org/10.3390/su14010433>

Conclusions

- **Business closures (lockdowns)** directly and/or indirectly impact more national well-being components than any other policy
- The most affected national well-being components by all policies are **life satisfaction, perceived health, and prevalence of depressive symptoms**
- Various components of national well-being system are highly intertwined
- Impact of COVID-19 policies on national well-being components happens over multiple, often contradictory pathways; strength and timing of individual impacts define the overall impact
- Policy interventions to enhance resilience should be planned taking this multiplicity and heterogeneity of impacts into account, this can help minimize risks of unintended consequences

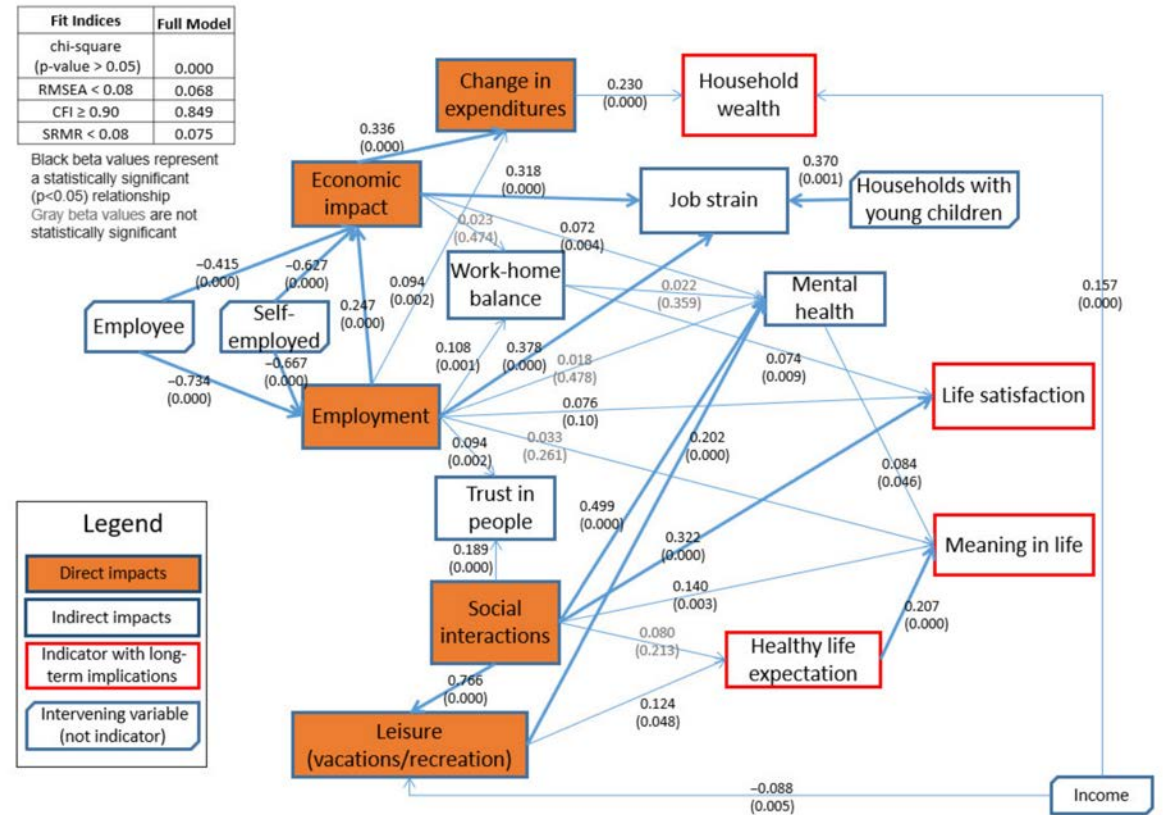
More details: Strelkovskii N, Rovenskaya E, Ilmola-Sheppard L, Bartmann R, Rein-Sapir Y, Feitelson E. Implications of COVID-19 Mitigation Policies for National Well-Being: A Systems Perspective. *Sustainability*. 2022; 14(1):433. <https://doi.org/10.3390/su14010433>

Applications and limitations of the systems approach

- Systemic (better) decision-making
 - Sense-making, understanding of indirect and feedback effects of policies
 - Identification of leverage points, tradeoffs and synergies (“triple win policies”)
 - Development of simulation models, e.g., systems dynamics
- Human brains have limited ability to execute systems thinking (Levy et al., 2018)
- Systems maps might be biased by their authors’ expertise, beliefs and values
 - Use external literature for validation
- Lack of quantitative perspective
 - Simulation or quantification nearly always adds value, even under uncertainties and difficulties related to the quantification of soft variables (Homer et al., 2001)

Possible ways forward

- Customize the systems map for concrete policy-relevant questions and/or countries and areas
 - Connecting to SDGs
- Use empirical data to confirm/reject the connections on the system map
 - Structural equation modeling, SEM
 - PVAR
- Use advanced methods for systems maps analysis (e.g., graph and network theory)
 - What is the net effect of a policy A on the outcome B – through all links connecting A and B directly and indirectly (higher orders)?



Source: Feitelson E, Plaut P, Salzberger E, Shmueli D, Altshuler A, Ben-Gal M, Israel F, Rein-Sapir Y, Zaychik D. The Effects of COVID-19 on Wellbeing: Evidence from Israel. *Sustainability*. 2022; 14(7):3750

PVAR WITH CONSTRAINT		Lagged variables						
		Neighbourhood safety	HH income	Higher education	Interpersonal trust	Life expectancy	Social support	Life satisfaction
Dependent variable	Neighbourhood safety		11.837***	0.751***				
	HH income			0.002				
	Higher education							
	Interpersonal trust	0.265***		-0.038				1.865**
	Life expectancy		0.903**	0.063***			0.028***	
	Social support			-0.017	0.136***			
	Life satisfaction	0.012***	1.907***				0.003	
			2	3	2	1	0	1

Source: Murtin F. Unpublished note. 2021

Thank you for your time!

Questions?