Maximize Utility Subject to $R \le 1$: A Simple Price-Theory Approach to Covid-19 Lockdown and Reopening Policy

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- ▶ But: because of the $R \le 1$ constraint, (1) reasonably approximates the pure medical objective in (2)
- ▶ At the same time, very different policy implications

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 - Society can do more activity, enjoy more utility, while keeping R < 1
- ightharpoonup Overall, optimal way to get to $R \leq 1$
 - ▶ Use masks, tests, etc. (except where reduction is trivial)
 - Then targeted activity bans

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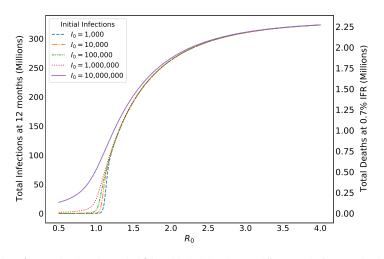
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- \blacktriangleright But: safe to say that society did not converge on "Max Utility s.t. $R \leq 1$ "

Why $R \leq 1$: Exponential Growth



Note: Output is based on the standard SIR model. Each line depicts a different initial infection seed. The γ parameter is fixed throughout at 1/5, which represents a duration of infectiousness of 5 days. The β parameter, which represents the rate of infectiousness, is varied such that $R_0=\beta/\gamma$ is the value depicted along the horizontal axis.

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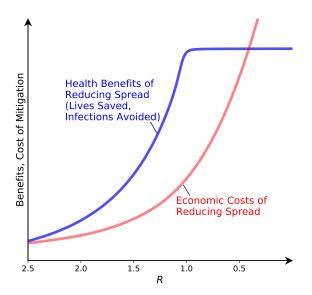
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- Aside on new variant
 - ightharpoonup Suppose R_0 is 4.0 instead
 - ► Then need a 3/4 reduction (i.e., $\frac{4-1}{4} = \frac{3}{4}$)
 - Again, not crazy

Is $R \leq 1$ Optimal? Simple Price Theory



Is $R \leq 1$ Enough? Too Much?

- ▶ Is $R \le 1$ enough?
 - If current Infected population already very high then may want a period of R << 1 to reduce Infected pop'n, then transition to $R \leq 1$, to satisfactorily approximate health objective in (2)
 - "Hammer and Dance", AEI "Road Map to Reopening"
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 - ► This formulation implicitly assumes mortality rate is high and Susceptible population is high.
 - ▶ If not then $R \le 1$ likely too restrictive
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- I will come back to both of these issues towards the end of the talk

- Society chooses a vector of activities $x \in X = [0,1]^n$. For each activity i:
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 $ightharpoonup R \le 1$ as a constraint:

$$\max_{x_i} \sum_{i=1}^{n} x_i (v_i - c_i)$$
 subject to
$$\sum_{i=1}^{n} x_i r_i \le 1$$
 (5)

Max Utility s.t. $R \leq 1$: Solution

Key object: ratio of economic value to disease-transmission risk for each activity i

$$\rho_i = \frac{(v_i - c_i)}{r_i}$$

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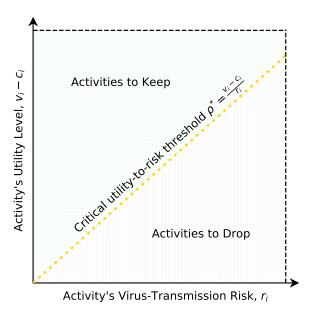
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 - optimum sorts not by absolute risk, but by utility per unit of risk

Solving the Basic Model: Graphic Depiction



Simple Interventions

- ▶ We know a <u>lot</u> about how Covid-19 spreads
- Relatively simple interventions can reduce risk meaningfully at low cost to utility
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- ▶ Thus: allows society to engage in more activity and achieve more utility while staying within $R \le 1$ budget

"Optimal Masks"

- Let's use the phrase "masks" to represent the suite of potential low-cost interventions
 - Changing over time as understanding improves
 - ► Avoiding phrase "NPIs" to distinguish from lockdowns (Ferguson et al, 2020)

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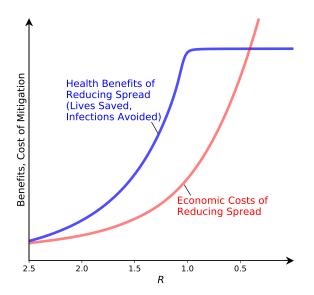
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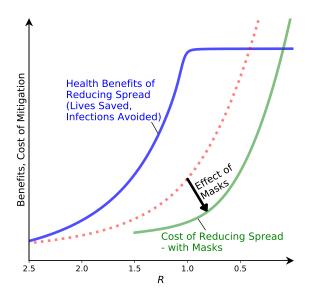
▶ The optimal mask policy for activity *i* maximizes

$$\begin{array}{ccccc} \underline{\Delta r_i} & \cdot & \underline{\rho^*} & - & \underline{\Delta u_i} \\ \text{risk reduction} & \text{marginal value} & \text{utility harm} \\ \text{from mask} & \text{of risk budget} & \text{of mask} \end{array}$$

Simple Interventions Reduce the Cost of Mitigation



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Numerical Example

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- Simple numerical example to convey importance of simple interventions
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- ▶ If society does all activities, then total risk is R₀ (that's what R₀ means: risk in a society that is unaware)
 - Consider range of 2.0-4.0
- "Masks" reduce risk by anywhere from 30-70%
 - Abaluck et al, Hatzius et al: cloth face-masks alone on order of 20-50% reduction
 - Chu et al, Howard et al, meta-analyses (labs, hospitals, ecological)
 - Romer mass tests
 - Other rapid test variations
 - Also: distance, hand-washing, etc.

Optimum without Simple Interventions

Value of R ₀					
2.0	2.5	3.0	3.5	4.0	
37.5	45.0	50.0	53.7	56.7	
18.8	27.0	33.3	38.3	42.3	
62.5	55.0	50.0	46.3	43.3	
81.2	73.0	66.7	61.7	57.7	
	37.5 18.8 62.5	2.0 2.5 37.5 45.0 18.8 27.0 62.5 55.0	2.0 2.5 3.0 37.5 45.0 50.0 18.8 27.0 33.3 62.5 55.0 50.0	2.0 2.5 3.0 3.5 37.5 45.0 50.0 53.7 18.8 27.0 33.3 38.3 62.5 55.0 50.0 46.3	

Optimum $\underline{\text{with}}$ Simple Interventions

Main R₀ Scenario

		Mask Efficacy				
N	lo Masks	30%	40%	50%	60%	70%
R if all activities are kept	2.50	1.75	1.50	1.25	1.00	0.75
To achieve $R \leq 1$:						
% Activities Dropped	45.0	32.1	25.0	15.0	0.0	0.0
% Pre-Virus Utility Dropped	27.0	13.8	8.3	3.0	0.0	0.0
Society % of Pre-Virus Utility:						
if Masks Reduce Utility by 0%	73.0	86.2	91.7	97.0	100.0	100.0
if Masks Reduce Utility by 109	% N/A	77.6	82.5	87.3	90.0	90.0

Note: The term "Masks" is used to denote the set of Simple Interventions including face-masks, tests, social distance, etc.

Optimum with Simple Interventions

High R_0 Scenario

		Mask Efficacy				
	lo Masks	30%	40%	50%	60%	70%
R if all activities are kept	4.00	2.80	2.40	2.00	1.60	1.20
To achieve $R \leq 1$:						
% Activities Dropped	56.7	48.2	43.7	37.5	28.1	12.5
% Pre-Virus Utility Dropped	42.3	31.0	25.5	18.8	10.5	2.1
Society % of Pre-Virus Utility:						
if Masks Reduce Utility by 0%	57.7	69.0	74.5	81.2	89.5	97.9
if Masks Reduce Utility by 10	% N/A	62.1	67.0	73.1	80.5	88.1

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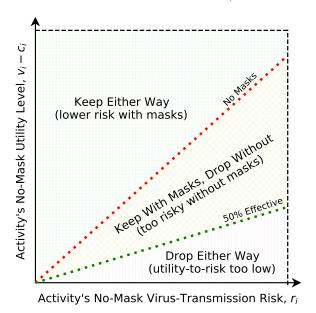
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Low R₀ Scenario

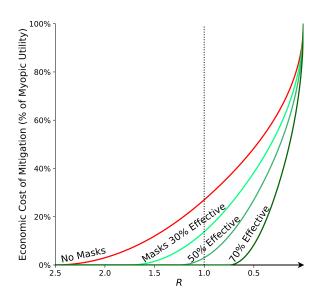
			Mask Efficacy				
N	lo Masks	30%	40%	50%	60%	70%	
R if all activities are kept	2.00	1.40	1.20	1.00	0.80	0.60	
To achieve $R \leq 1$:							
% Activities Dropped	37.5	21.4	12.5	0.0	0.0	0.0	
% Pre-Virus Utility Dropped	18.8	6.1	2.1	0.0	0.0	0.0	
Society % of Pre-Virus Utility:							
if Masks Reduce Utility by 0%	81.2	93.9	97.9	100.0	100.0	100.0	
if Masks Reduce Utility by 10	% N/A	84.5	88.1	90.0	90.0	90.0	

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Effect of Simple Interventions on Keep/Drop



Effect on the Economic Cost of Mitigation

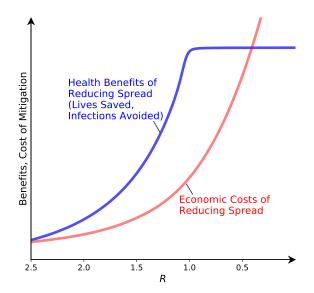


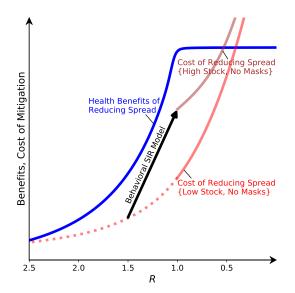
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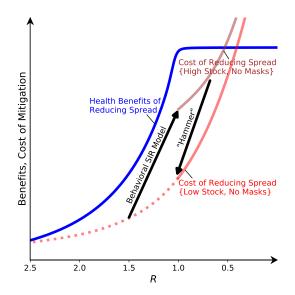
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 - ► Also: Goolsbee and Syverson evidence that "fear of the virus" itself will cause behavior change

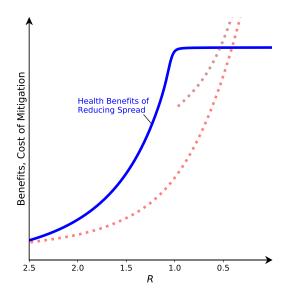
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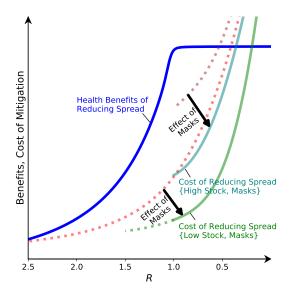
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 - ► Also: Goolsbee and Syverson evidence that "fear of the virus" itself will cause behavior change
- ► Is *R* < 1 Too Much?
 - "Herd immunity": if R > 1, then eventually 200+ million infections
 - Initially there was a lot of uncertainty about infection fatality rate and rates of severe cases
 - With what we know now: the more credible case to consider is a "Young-Old" strategy, along the lines of Acemoglu, Chernozhukov, Werning and Whinston (also Great Barrington Declaration)

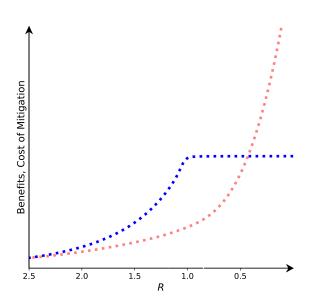


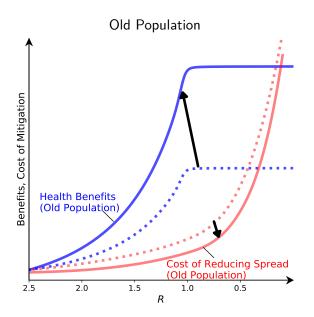


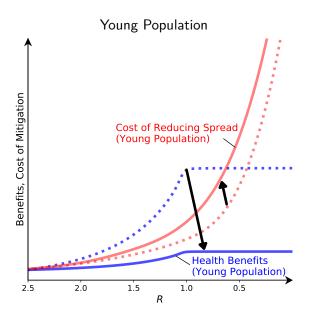


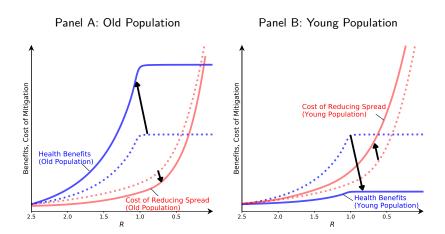












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- ▶ Recall: even $R = 1.5 \rightarrow 200$ million infections in 12 months

2. Eradication likely not feasible

- By the time of policy intervention, eradication unrealistic for many countries
- ► (If eradication were feasible: like a one-time fixed cost, versus ongoing costs of containment)

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3. $R \le 1$ feasible with modestly expensive measures

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- Atul Gawande: "if you have hygiene, distancing, mandatory masks, and screen everybody for symptoms so that they stay home and get tested, that shuts the virus down"

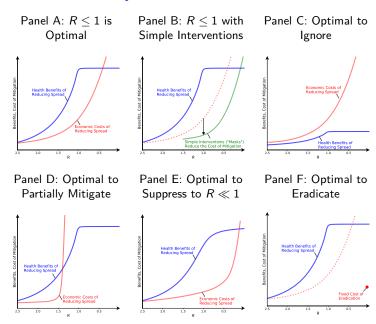
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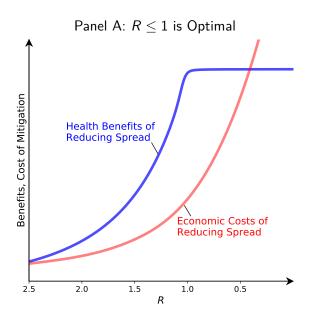
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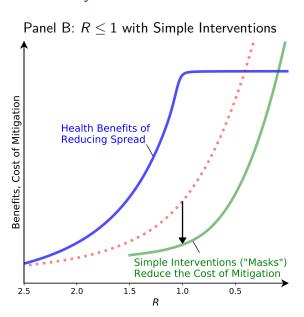
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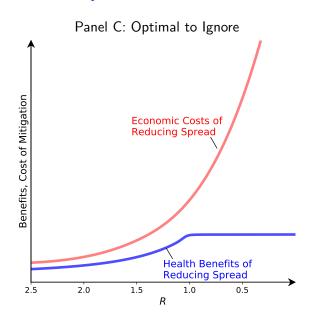
4. Minimize unboundedly expensive

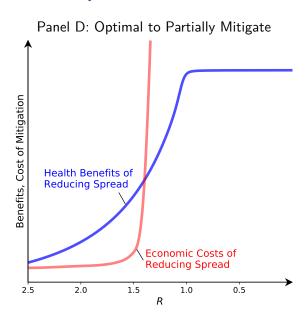
- When eradication is infeasible, second-best is "minimize" (Osterholm)
- However, hard to think about tradeoffs if the interventions themselves are very expensive
- Useful contrast: HIV

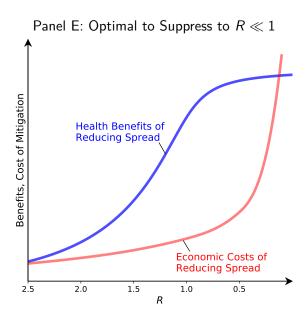


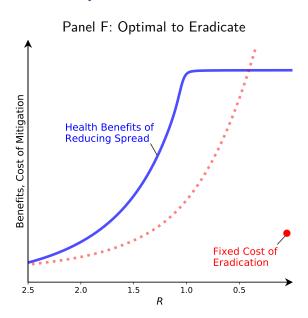












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- ▶ That is, contain the exponential growth as efficiently as possible
- ► Final point: this paper, at most, puts economics language on a formulation many others converged on as well
- ▶ Hopefully we will do a better job in the next pandemic.