The Distributional Effects of COVID-19 and Optimal Mitigation Policies

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The views expressed herein are those of the author and not necessarily those of the Federal Reserve Bank of Dallas or the Federal Reserve System.

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▶ Is there a tradeoff between public health and economic outcomes? Not necessarily

- To better understand the economic-health tradeoff (or lack thereof), I build a quantitative model to use as a laboratory for policy counterfactuals
- Key ingredients:
 - heterogeneity in age
 - old individuals face higher fatality risk
 - young individuals face worse labor market outcomes
 - heterogeneity in income and wealth
 - two-way feedback between economic activity and virus transmission

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- Key ingredients:
 - heterogeneity in age
 - heterogeneity in income and wealth
 - most low-wage workers cannot work from home
 - many low-wealth workers lack the resources to weather prolonged time away from work
 - two-way feedback between economic activity and virus transmission

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- Key ingredients:
 - heterogeneity in age
 - heterogeneity in income and wealth
 - two-way feedback between economic activity and virus transmission
- Other ingredients:
 - endogenous labor with option to work from home
 - optimal outside/home consumption and saving decisions
 - hospital capacity constraints

- Without mitigation, young workers engage in too much economic activity, relative to the social optimum
 - especially true for young low-wage/wealth workers
 - leading to higher infection rates and deaths in the aggregate
- Mitigation policies
- Stay-at-home subsidy reduces deaths by more and output by less
- ▶ Welfare maximizing Pareto improvement
- Output maximizing policy

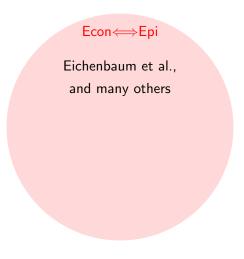
- ▶ Without mitigation, young workers engage in too much economic activity, relative to the social optimum
- Mitigation policies
 - stay-at-home subsidy (e.g. FPUC)
 - stay-at-home order (lockdown) that imposes a cap on outside work hours
 - (e.g. stay-at-home, shelter-at-home, safe-at-home orders)
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- ► Without mitigation, young workers engage in too much economic activity, relative to the social optimum
- ► Mitigation policies
- Stay-at-home subsidy reduces deaths by more and output by less
 - lockdown benefits older individuals at the expense of low-wage workers
 - stay-at-home subsidy benefits all
- ▶ Welfare maximizing Pareto improvement
- ▶ Output maximizing policy

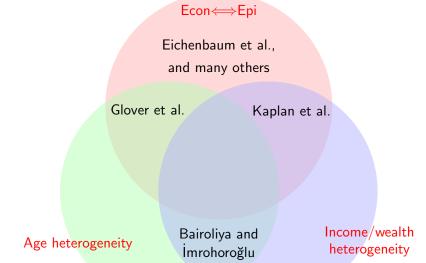
- ► Without mitigation, young workers engage in too much economic activity, relative to the social optimum
- ▶ Mitigation policies
- Stay-at-home subsidy reduces deaths by more and output by less
- Welfare-maximizing Pareto improvement
 - weekly subsidy of \$1050 (gradually phased out after 7 months)
 - no lockdown
 - reduces deaths by 60 percent and output by 2 percent, compared to no mitigation

- ► Without mitigation, young workers engage in too much economic activity, relative to the social optimum
- ▶ Mitigation policies
- Stay-at-home subsidy reduces deaths by more and output by less
- ► Welfare maximizing Pareto improvement
- Output maximizing policy
 - weekly subsidy of \$350 (gradually phased out after 13 months)
 - no lockdown
 - reduces deaths by 20 percent and increases output by 2 percent, compared to no mitigation

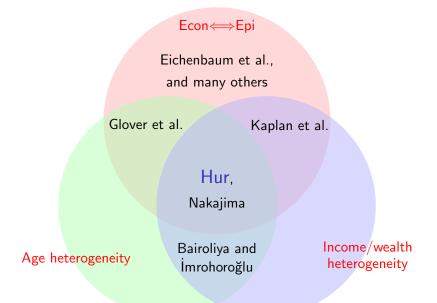
Relation to literature



Relation to literature



Relation to literature



Model

Features of model

- Stochastic aging
- ► Wage fluctuations + borrowing constraints + incomplete markets → precautionary savings
- Outside versus home consumption
- Endogenous labor supply with option to work from home
- ► Economic-Epidemiology model (economic activities ←→ virus transmission)
- Hospital capacity constraints

Demographics

- ▶ Individuals of age denoted by $j \in J \equiv \{1, 2, ..., \overline{J}\}$
- Stochastic aging
 - $\blacktriangleright \psi_j$: probability of transitioning from age j to j+1
- ightharpoonup Retirement at $j = J^R$
- ▶ Health status $h \in \{S, I, R, D\}$

Demographics

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- ► Stochastic aging
- ightharpoonup Retirement at $j = J^R$
- ► Health status $h \in \{S, I, R, D\}$ for Susceptible, Infected, Recovered, and Dead

Epidemiological block

- Build on widely used SIR model
- Susceptible individuals get infected with probability π_{It} , which depends on individual outside consumption and labor (c_o, ℓ_o) and the measure of infected individuals (μ_{It}) and their outside consumption and labor (C_{It}^o, L_{It}^o)

$$\pi_{It}(c_o, \ell_o) = \beta_c c_o C_{It}^o + \beta_\ell \ell_o L_{It}^o + (\beta_e + \epsilon_t) \mu_{It}$$

where ϵ_t captures time-varying transmissibility (e.g. seasonal factors)

- ▶ Infected individuals exit infection with probability π_X
- ▶ Recovered individuals are assumed to be immune
- Let $\Pi_{jhh't}(c_o, \ell_o)$ denote the transition matrix

Epidemiological block

- ► Build on widely used SIR model
- Susceptible individuals get infected with probability π_{lt} , which depends on individual outside consumption and labor (c_o, ℓ_o) and the measure of infected individuals (μ_{lt}) and their outside consumption and labor (C_{lt}^o, L_{lt}^o)
- ▶ Infected individuals exit infection with probability π_X , then
 - recover with prob. $1 \delta_j(\mu_{It})$
 - ▶ die with prob. $\delta_i(\mu_{It})$
- Recovered individuals are assumed to be immune
- Let $\Pi_{jhh't}(c_o, \ell_o)$ denote the transition matrix

Labor income

- ▶ Each period, workers receive idiosyncratic productivity shocks $\varepsilon \in E$, which follows a Markov process, with trans. matrix Γ
- ► Their labor income is given by $w_t \eta_{jh} \varepsilon \ell$, where
 - \triangleright w_t : efficiency wage
 - $ightharpoonup \eta_{jh}$: age-health-profile of efficiency units
- ▶ A fraction $\bar{\theta}_{i}(\varepsilon)$ of labor can be done at home
- Retirees receive a fixed income of s each period
 - can easily depend on lifetime earnings as in Hur (2018)

Retiree's problem

▶ Retirees with age $j \ge J^R$, wealth k, and health h choose inside and outside consumption c_i , c_o and savings k' to solve:

$$\begin{aligned} v_{jt}^{R}(k,h) &= \max_{c_{i},c_{o},k' \geq 0} \ u(c_{i},c_{o}) + \bar{\mathbf{u}} + \hat{\mathbf{u}}^{h} + \beta \sum_{h' \in H} \Pi_{jhh't}(c_{o},0) \\ &\times \left[\psi_{j} v_{j+1,t+1}^{R}(k',h') + (1-\psi_{j}) v_{j,t+1}^{R}(k',h') \right] \\ \text{s.t.} \ (1+\tau_{ct})c + k' \leq s + k(1+r_{t}) \end{aligned}$$

- $ightharpoonup \bar{u}, \hat{u}_h$: flow value of life, health
- $c = c_o + c_i$
- $v_{\bar{l}+1}^{R} = 0$
- ightharpoonup au_{ct} : consumption tax
- $ightharpoonup r_t$: net return to capital

Worker's problem

▶ Workers with age $j < J^R$, wealth k, productivity ε , and health h choose consumption c_i, c_o , inside and outside labor ℓ_i, ℓ_o , and savings k' to solve:

$$\begin{aligned} v_{jt}(k,\varepsilon,h) &= \max_{\substack{c_i,c_o,\ell_i\\\ell_o,k'\geq 0}} \ u(c_i,c_o) - g(\ell) + \bar{u} + \hat{u}^h + \beta \sum_{\varepsilon'\in E} \sum_{h'\in H} \Gamma_{\varepsilon,\varepsilon'} \Pi_{jhh't}(c_o,\ell_o) \\ &\times [\psi_j v_{j+1,t+1}(k',\varepsilon',h') + (1-\psi_j)v_{j,t+1}(k',\varepsilon',h')] \\ \text{s.t.} \quad (1+\tau_{ct})c + k' \leq w_t \eta_{jh} (1-\tau_{\ell t})\varepsilon\ell + k(1+r_t) + T_t(\ell) \\ \ell_i \leq \overline{\theta}_i(\varepsilon)\ell, \ \ell_o \leq \overline{\ell}_{ot} \end{aligned}$$

- $\ell = \ell_i + \ell_o$
- ▶ Let $v_{jt}(k, \varepsilon, h) = v_{it}^R(k, h)$ for $j \ge J^R$
- $ightharpoonup au_{\ell t}$: labor income tax
- $ightharpoonup g(\ell)$: disutility of labor

Optimality conditions (h = S)

$$\begin{split} \frac{\partial u}{\partial c_{i}} &= \frac{\partial u}{\partial c_{o}} - \beta_{c} C_{lt}^{o} \beta \sum_{\varepsilon' \in E} \Gamma_{\varepsilon, \varepsilon'} \\ &\times \underbrace{ \begin{cases} \psi_{j} \left[v_{j+1, t+1}(k', \varepsilon', S) - v_{j+1, t+1}(k', \varepsilon', I) \right] \\ + (1 - \psi_{j}) \left[v_{j, t+1}(k', \varepsilon', S) + v_{j, t+1}(k', \varepsilon', I) \right] \end{cases}}_{\text{value of remaining susceptible}} \end{split}$$

$$\begin{split} w_{t}\eta_{jS}\varepsilon\frac{\partial u}{\partial c_{i}}\frac{1-\tau_{\ell t}}{1+\tau_{ct}} &= -\frac{\partial g}{\partial \ell} - (1-\bar{\theta}_{j}(\varepsilon))\beta_{\ell}L_{lt}^{o}\beta\sum_{\varepsilon'\in E}\Gamma_{\varepsilon,\varepsilon'} \\ &\times\underbrace{\left\{\begin{array}{l} \psi_{j}\left[v_{j+1,t+1}(k',\varepsilon',S)-v_{j+1,t+1}(k',\varepsilon',I)\right]\\ +(1-\psi_{j})\left[v_{j,t+1}(k',\varepsilon',S)+v_{j,t+1}(k',\varepsilon',I)\right] \end{array}\right\}}_{\end{split}}$$

value of remaining susceptible

Production

► A representative firm solves

$$\max L_f^{1-\alpha} K_f^{\alpha} - w_t L_f - (r_t + \delta) K_f$$

where L_f are effective units of labor demanded

► Optimality conditions:

$$w_{t} = (1 - \alpha) \left(\frac{K_{f}}{L_{f}}\right)^{\alpha}$$

$$r_{t} = \alpha \left(\frac{K_{f}}{L_{f}}\right)^{\alpha - 1} - \delta$$

Rest of talk

- 1. Calibrate the model
 - pre-pandemic steady state Pefinition of equilibrium
 - transition path
- Model fit
- 3. Welfare consequences of pandemic and U.S. mitigation policies
- 4. Optimal mitigation policies

Calibration

Envioronment

- ► Period length: 2 weeks
- ▶ Number of age cohorts: 3 (25–44, 45–64, 65+)
- Newborn endowments: 85% begin with zero wealth and 15% receive accidental bequests ($\sim 28 \times$ annual per capita cons.)
- Preferences

$$egin{aligned} u(c_i,c_o) &= rac{\left(c_i^{\gamma}c_o^{1-\gamma}
ight)^{1-\sigma}}{1-\sigma} \ g(\ell) &= arphirac{\ell^{1+
u}}{1+
u} + \mathbb{1}_{\ell=0} ilde{u} \end{aligned}$$

 \tilde{u} : disutility from not working (e.g. administrative costs, stigma, or any other costs not modeled)

Labor income

- ► Labor that can be done from home: set to match the Dingel and Neiman (2020) average share of jobs that can be done from home by occupations sorted into wage quintiles: 0.03, 0.21, 0.32, 0.47, 0.66
- ▶ Productivity shocks (ε) follow a finite-state Markov process which approximates the continuous process,

$$\log \varepsilon_t = \rho_\varepsilon \log \varepsilon_{t-1} + \nu_t, \ \nu_t \sim N\left(0, \sigma_\nu^2\right)$$

- Estimate using wage residuals constructed from PSID
 - $ho_{\varepsilon} = 0.94$ and $\sigma_{\nu} = 0.19$
 - Convert to higher frequency, following Krueger et al. (2016)

Economic parameters

Parameters	Values	Targets / Source
Discount factor, annualized, β	0.97	Wealth-to-GDP: 4.8 (BOG, 2019)
Risk aversion, σ	2	Standard value
Inside consumption share, γ	0.51	Expenditure share (BEA, 2019)
Disutility from labor, φ	22.64	Average weekly hours: 34.4 (BEA, 2019)
Frisch elasticity, $1/ u$	0.50	Standard value
Death prob., annualized, ψ_3	0.10	65+ share of population 25+: 0.2
Aging prob., annualized, $\psi_1=\psi_2$	0.05	Expected duration: 20 years
Efficiency units, $\eta_{1R}=\eta_{1S}$	1.00	Wage ratio of age 45–64 to
$\eta_{2R}=\eta_{2S}$	1.35	age 25–44 workers (PSID, 2014)
Factor elasticity, α	0.36	Capital share
Depreciation, annualized, δ	0.05	Standard value
Retirement income, s	1.00	30% of earnings per worker
Labor income tax, $ au_\ell$	0.07	Gov't budget constraint
Consumption tax, $ au_c$	0.00	
Transfer, T	0.00	

Epidemiological parameters

Death rates: as in Piguillem and Shi (2020) and other papers,
 I use the functional form

$$\delta_j(\mu_I) = \delta^u_j \min\left\{1, rac{\kappa}{\mu_I}
ight\} + \delta^c_j \max\left\{0, 1 - rac{\kappa}{\mu_I}
ight\}$$

- \triangleright δ_i^u : unconstrained death rates
- \triangleright δ_i^c : untreated death rates
- \triangleright κ : measure of infected individuals that can be treated
- 924 thousand hospital beds in the US (0.28% of population)

Epidemiological parameters

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$$\delta_j(\mu_I) = \delta^u_j \min\left\{1, \frac{\kappa}{\mu_I}\right\} + \delta^c_j \max\left\{0, 1 - \frac{\kappa}{\mu_I}\right\}$$

- \triangleright δ_i^u : unconstrained death rates
- \blacktriangleright δ_i^c : untreated death rates
- \triangleright κ : measure of infected individuals that can be treated
- ▶ 924 thousand hospital beds in the US (0.28% of population)
 - **ightharpoonup** not all infected cases require hospitalization $ightarrow \kappa = 0.01$

Reproduction number

Total new infections:

$$T_t = \beta_c C_{St}^o C_{It}^o + \beta_\ell L_{St}^o L_{It}^o + (\beta_e + \epsilon_t) \mu_{St} \mu_{It}$$

▶ The basic reproduction number, as $\mu_I \to 0$ and $\epsilon_t = 0$, assuming $C_I^o/\mu_I \to C_S^o/\mu_S$ and $L_I^o/\mu_I \to L_S^o/\mu_S$, is given by

$$R_0 = \frac{\beta_c (C_S^o)^2 + \beta_\ell (L_S^o)^2 + \beta_e}{\pi_X}$$

assuming that initially people are not working from home

- ▶ Most estimates range between 2.2 and 3.1. I use $R_0 = 2.2$
- between 3 channels (evidence from other infectious disease

Reproduction number

- ▶ Total new infections
- ▶ The basic reproduction number, as $\mu_I \rightarrow 0$ and assuming $C_I^o/\mu_I \rightarrow C_S^o/\mu_S$ and $L_I/\mu_I \rightarrow L_S/\mu_S$, is given by

$$R_0 = \frac{\beta_c(C_S^o)^2 + \beta_\ell(L_S)^2 + \beta_{e0}}{\pi_X}$$

- ▶ Most estimates range between 2.2 and 3.1. I use $R_0 = 2.2$
- ▶ I assume that, initially, virus transmission equally likely between 3 channels (evidence from other infectious diseases: Ferguson et al. 2006, Mossong et al. 2008)

Epidemiological parameters (2)

Parameters	Values	Targets / Source
Infection exit rate, π_X	0.78	Expected infection duration: 18 days
Unconstrained death rate,		Fatality rates in South Korea
$\delta_1^u imes 100$	0.08	
$\delta_2^u imes 100$	0.85	
$\delta_3^u imes 100$	8.47	
Untreated death rate, δ^c_j	$2\delta^u_j$	Piguillem and Shi (2020)
Flow value of life, \bar{u}	25.91	VSL: \$7.4 mil. (EPA, 2006) • Derivation
Flow value of infection, \hat{u}^I	-12.48	50 percent reduction in flow
		utility value of average agent
Disutility of not working, $\tilde{\textit{u}}$	0.62	19 percent reduction in employment
Efficiency units, η_{jl}	$0.5\eta_{jS}$	

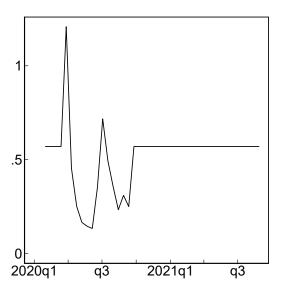
Transition path with pandemic

- COVID-19 introduced as an unanticipated MIT-shock
 - initial infections are set to 0.5 percent to match 17,982 deaths in the US during $3/27-4/9\ (t=1)$
- ▶ Use first six months of the pandemic to fit $\beta_e + \epsilon_t$ to biweekly deaths (capturing seasonal factors, etc.)
- ▶ Fiscal policies that are relevant for virus mitigation
- ► Transition path solved in partial equilibrium

Transition path with pandemic

- ► COVID-19 introduced as an unanticipated MIT-shock
- ▶ Use first six months of the pandemic to fit $\beta_e + \epsilon_t$ to biweekly deaths (capturing seasonal factors, etc.)
 - ightharpoonup set $\epsilon_t = 0$ after first six months
- ▶ Policies that are relevant for virus mitigation
- transition path solved in partial equilibrium

Time-varying transmissibility $(\beta_e + \epsilon_t)$



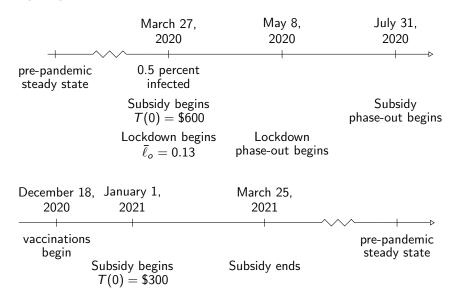
Transition path with pandemic

- ► COVID-19 introduced as an unanticipated MIT-shock
- ▶ Use first six months of the pandemic to fit $\beta_e + \epsilon_t$ to biweekly deaths (capturing seasonal factors, etc.)
- Policies that are relevant for virus mitigation
 - 1. stay-at-home subsidy (subsidy): \$600 subsidy to individuals working 0 hours per week (e.g. FPUC)
 - 2. stay-at-home order (lockdown): impose a cap of 15 outside work hours per week
- Transition path solved in partial equilibrium

Transition path with pandemic

- ► COVID-19 introduced as an unanticipated MIT-shock
- ▶ Use first six months of the pandemic to fit $\beta_e + \epsilon_t$ to biweekly deaths (capturing seasonal factors, etc.)
- ▶ Policies that are relevant for virus mitigation
- ► Transition path solved in partial equilibrium
 - prices fixed
 - retirement benefits and contributions fixed
 - newborn distribution fixed

Timeline

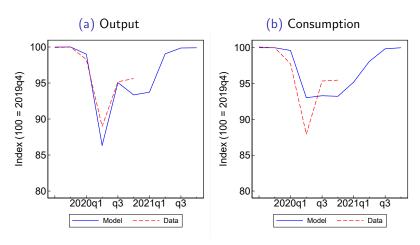


Model validity

Pre-pandemic steady state

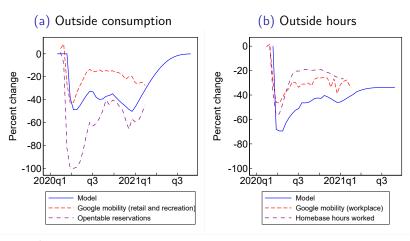
	Data	Model
Targeted moments		
wealth/GDP	4.8	4.8
average weekly hours	34.4	34.4
average VSL (annual cons. per capita)	238.8	238.8
Nontargeted moments		
disposable earnings gini	0.37	0.36
consumption gini	0.33	0.25
wealth gini	0.74	0.59
wealth p75/p25	11.9	13.2

Aggregates during the pandemic



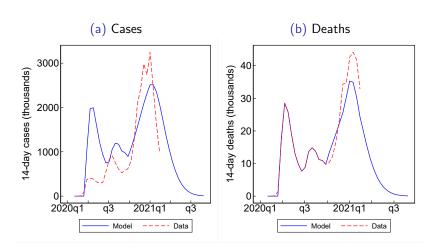
Notes: Both consumption and output in the data are linearly detrended at 2 percent per year.

Aggregates during the pandemic (2)



Notes: Outside consumption and hours in the model is relative to the pre-pandemic steady state. Google mobility and Opentable reservations are year over year percent changes. Homebase hours are relative to the median for each day of the week during January 4–31, 2020.

Aggregates during the pandemic (3)



- Use the calibrated model to investigate the aggregate and distributional effects of the pandemic and mitigation policies
- First, explore how the economic-epi model of virus transmission differs from an exogenous one $(\beta_c = \beta_\ell = 0)$
 - private mitigation is very heterogeneous across age, income, and wealth
- ► Second, explore optimal mitigation policies

- Use the calibrated model to investigate the aggregate and distributional effects of the pandemic and mitigation policies
- ► First, explore how the economic-epi model of virus transmission differs from an exogenous one $(\beta_c = \beta_\ell = 0)$
- Second, evaluate US mitigation policies
 - stay-at-home subsidies (e.g. FPUC)
 - stay-at-home orders
- Third, explore optimal mitigation policies

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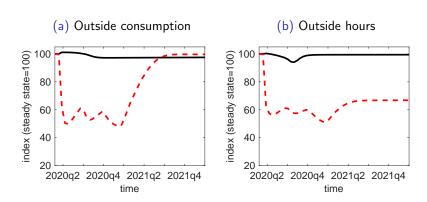
Private mitigation

- ► To understand the magnitude and properties of private mitigation, compare
 - calibrated model without mitigation policy (i.e.

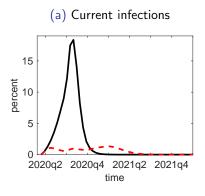
$$T(0) = 0, \bar{\ell}_o >> 0$$

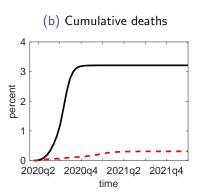
• exogenous SIR model ($\beta_c = \beta_\ell = 0$)

Private mitigation is large ...



.. leading to less deaths



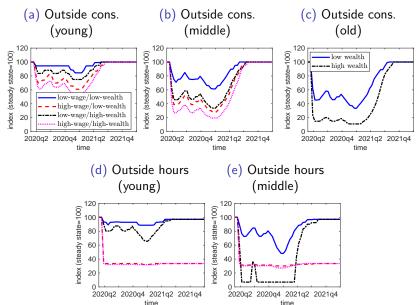


Notes: Percent of population 25+

Private mitigation is heterogeneous

- ▶ Private mitigation is increasing in
 - age
 - income
 - wealth

Policy functions of susceptible individuals



US Mitigation Policies

COVID-19 and US mitigation policies

	no mitigation	US mitigation	subsidy only	lockdown only
welfare	-8.0	-6.4	-6.4	-7.8
working-age	-4.9	-3.8	-3.8	-4.9
retired	-20.4	-16.8	-16.9	-19.8
low-wage	-3.1	-2.2	-2.2	-3.2
high-wage	-6.8	-5.4	-5.4	-6.5
low-wealth	-6.0	-4.6	-4.6	-6.0
high-wealth	-10.0	-8.2	-9.2	-9.7
policy support		100.0	100.0	81.4
2-year output	95.6	95.8	96.6	95.0
deaths per 10k	20.6	16.0	16.2	19.8

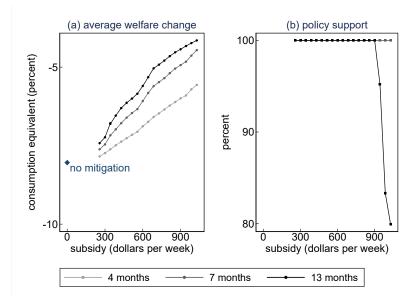
Notes: Low- and high-wage (wealth) correspond to below and above the median wage (wealth), respectively. Welfare reports consumption equivalents (percent). 2-year output is indexed to 2-year output in the pre-pandemic steady state

Optimal Policies

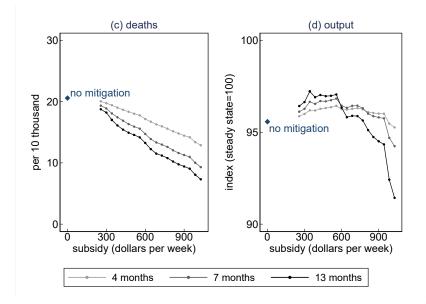
Optimal Policies

- Investigate the properties of optimal mitigation policies, within a limited set of instruments
 - subsidy amount
 - duration
 - ▶ speed of phase-out
 - ▶ lockdown, with varying intensities
- Characterize:
 - Constrained optimal policy (welfare-maximizing Pareto improvement)
 - Output maximizing policy

Larger & longer subsidies improve welfare ...



.. lead to less deaths and possibly lower output



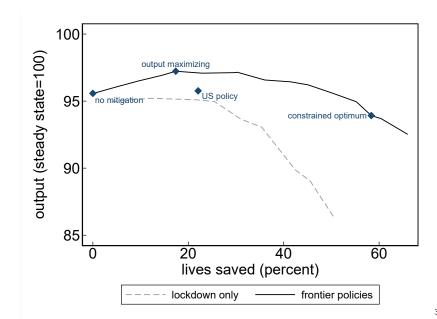
How mitigation policies can increase output

- Mitigation policies can increase output (relative to no mitigation)
- ► This is due to two opposing effects
 - 1. Direct effect: subsidy reduces labor supply, holding fixed the severity of the pandemic
 - 2. Indirect effect: subsidy attenuates the pandemic, leading to increased labor supply
- ► For moderate subsidy amounts (less than \$600), only low-wage workers reduce their hours, leading to a smal decline in output
- ▶ Because low-wage hours are almost exclusively outside, almost all of the reduction in hours contribute to mitigating the virus, making it safer to engage in more economic activities

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- ► For moderate subsidy amounts (less than \$600), only low-wage workers reduce their hours, leading to a small decline in output
- Because low-wage hours are almost exclusively outside, almost all of the reduction in hours contribute to mitigating the virus, making it safer to engage in more economic activities

Not necessarily a trade-off between lives and output



Optimal policy breakdown

				م راه ما در	+
	no 	maximizing 	optimal 	subsidy	tax
	mitigation	policy	policy	only	only
subsidy (\$/week)	0	350	1050	1050	0
duration (months)	0	13	7	7	7
cons. tax (pct)	0	0.4	36.5	0	36.5
lockdown	no	no	no	no	no
welfare	-8.0	-6.8	-4.3	-4.3	-8.2
working-age	-4.9	-4.1	-2.3	-2.0	-5.3
retired	-20.4	-17.7	-11.8	-13.4	-19.6
low-wage	-3.1	-2.5	-0.8	-0.1	-3.7
high-wage	-6.8	-5.7	-3.9	-4.0	-6.8
low-wealth	-6.0	-4.9	-2.7	-2.2	-6.4
high-wealth	-10.0	-8.6	-5.7	-6.4	-9.8
policy support		100.0	100.0	100.0	37.9
2-year output	95.6	97.2	93.9	93.7	96.0
deaths per 10k	20.6	17.0	8.6	12.0	18.0

Notes: Welfare reports consumption equivalents (percent). 2-year output is indexed to 2-year output in the pre-pandemic steady state.

Conclusion

- Quantitative life-cycle economic-epidemiology model
 - measure the heterogeneous welfare effects of COVID-19
 - evaluate mitigation policies
- Stay-at-home subsidies dominate stay-at-home orders
- Optimal mitigation policies involve large subsidies and no lockdowns
- ▶ There need not be a tradeoff between saving lives and output

${\sf Appendix}$

Equilibrium Phack

- ▶ Let $X = K \times E \times H$ denote the state space over wealth, productivity, and health
- Let a σ -algebra over X defined by the Borel sets, \mathcal{B} , on X.
- ▶ A steady-state recursive equilibrium, given fiscal policies $\{\tau_c, \tau_\ell, s\}$, is
 - ▶ value functions $\{v_j\}_{j\in J}$,
 - ▶ policy functions $\{c_{ji}, c_{jo}, \ell_{ji}, \ell_{jo}, k'_j\}_j$,
 - ▶ producer plans $\{Y_f, L_f, K_f\}$
 - \triangleright prices $\{w, r\}$,
 - ightharpoonup distribution of newborns ω
 - ightharpoonup invariant measures $\{\mu_j\}_j$

such that:

Equilibrium (2) Phack

- 1. Given prices, workers and retirees optimize
- 2. Given prices, firms optimize
- 3. Goods and factor markets clear
- 4. Government budget holds:

$$\begin{split} s \int_{X} \sum_{j \geq J^{R}} d\mu_{j}(k, \varepsilon, h) &= \\ \tau_{\ell} \int_{X} \sum_{j < J^{R}} w \eta_{jh} \varepsilon \left[\ell_{ji}(k, \varepsilon, h) + \ell_{jo}(k, \varepsilon, h) \right] d\mu_{j}(k, \varepsilon, h) \\ &+ \tau_{c} \int_{X} \sum_{i \in J} \left[cji(k, \varepsilon, h) + cjo(k, \varepsilon, h) \right] d\mu_{j}(k, \varepsilon, h) \end{split}$$

Equilibrium (3) Phack

5. for any $(\mathcal{K}, \mathcal{E}, \mathcal{H}) \in \mathcal{B}$, the invariant measure μ_j satisfies

$$\mu_{j}(\mathcal{K}, \mathcal{E}, \mathcal{H}) = \int_{\mathcal{X}} \psi_{j-1} \mathbb{1}_{\left\{k'_{j-1}(k, \varepsilon, h) \in \mathcal{K}\right\}} \sum_{\varepsilon' \in \mathcal{E}} \sum_{h' \in \mathcal{H}} \Gamma_{\varepsilon, \varepsilon'} \Pi_{jhh'} d\mu_{j-1}(k, \varepsilon, h)$$
$$+ \int_{\mathcal{X}} (1 - \psi_{j}) \mathbb{1}_{\left\{k'_{j+1}(k, \varepsilon, h) \in \mathcal{K}\right\}} \sum_{\varepsilon' \in \mathcal{E}} \sum_{h' \in \mathcal{H}} \Gamma_{\varepsilon, \varepsilon'} \Pi_{jhh'} d\mu_{j}(k, \varepsilon, h)$$

and

$$\mu_{1}(\mathcal{K}, \mathcal{E}, \mathcal{H}) = \int_{\mathcal{X}} (1 - \psi_{1}) \mathbb{1}_{\left\{k'_{1}(k, \varepsilon, h) \in \mathcal{K}\right\}} \sum_{\varepsilon' \in \mathcal{E}} \sum_{h' \in \mathcal{H}} \Gamma_{\varepsilon \varepsilon'} \Pi_{hh'} d\mu_{1}(k, \varepsilon, h) + \omega(\mathcal{K}, \mathcal{E}, \mathcal{H})$$

Equilibrium (4) Phack

6. The newborn distribution satisfies:

$$\int_X k d\omega(k,\varepsilon,h) = \int_X \psi_{\bar{J}} k'_{\bar{J}}(k,\varepsilon,h) d\mu_{\bar{J}}(k,\varepsilon,h)$$

Derivation of \bar{u} pack

▶ Pre-pandemic steady-state value

$$v_{j}(k,\varepsilon) = \frac{\left(\left(c_{i}^{*}\right)^{\gamma}\left(c_{o}^{*}\right)^{1-\gamma}\right)^{1-\sigma}}{1-\sigma} - \varphi \frac{\left(\ell_{i}^{*} + \ell_{o}^{*}\right)^{1+\nu}}{1+\nu} + \bar{u}$$
$$+ \beta \sum_{\varepsilon' \in E} \Gamma_{\varepsilon,\varepsilon'} \left[\psi_{j} v_{j+1}(k',\varepsilon') + (1-\psi_{j}) v_{j}(k',\varepsilon')\right]$$

 $ightharpoonup c_i^*, c_o^*, \ell_i^*, \ell_o^*$: pre-pandemic steady-state policy functions

Derivation of \bar{u} (2)

Imposing optimality conditions

$$v_{j}(k,\varepsilon) = \frac{\left[\left(c^{*} + \Delta_{c}\right)\gamma^{\gamma}(1-\gamma)^{1-\gamma}\right]^{1-\sigma}}{1-\sigma} - \varphi \frac{\left(\ell_{i}^{*} + \ell_{o}^{*}\right)^{1+\nu}}{1+\nu} + \bar{u}$$
$$+ \beta(1+\Delta_{s})\sum_{\varepsilon'\in E} \Gamma_{\varepsilon,\varepsilon'} \left[\psi_{j}v_{j+1}(k',\varepsilon') + (1-\psi_{j})v_{j}(k',\varepsilon')\right]$$

- $c^* = c_i^* + c_o^*$
- $lackbox{}{\Delta_c, \Delta_s}$: small one-time deviations to consumption and survival probability

Derivation of \bar{u} (3)

► The VSL—defined as the marginal rate of substitution between survival and consumption—can be expressed as

$$\textit{VSL} = \left. \frac{\frac{\partial \textit{v}}{\partial \Delta_{s}}}{\frac{\partial \textit{v}}{\partial \Delta_{c}}} \right|_{\Delta_{c} = 0, \; \Delta_{s} = 0} = \frac{\beta \sum\limits_{\textit{\varepsilon}' \in \textit{E}} \Gamma_{\textit{\varepsilon}, \textit{\varepsilon}'} \left[\psi_{j} \textit{v}_{j+1}(\textit{k}', \textit{\varepsilon}') + (1 - \psi_{j}) \textit{v}_{j}(\textit{k}', \textit{\varepsilon}') \right]}{c^{* - \sigma} \left(\gamma^{\gamma} \left(1 - \gamma \right)^{1 - \gamma} \right)^{1 - \sigma}}$$

▶ Set \bar{u} such that $\frac{\mathbb{E}(\textit{VSL})}{\mathbb{E}(c)} = \frac{\$7.4 \text{ million}}{\$30989 \times 14/365} = 6226$