

An economic model of the Covid-19 pandemic with young and old agents: Behavior, testing and policies

Luiz Brotherhood, Universitat de Barcelona

Philipp Kircher, Cornell University, UCLouvain and University of Edinburgh

Cezar Santos, Banco de Portugal & FGV EPGE

Michèle Tertilt, University of Mannheim

Warwick University, February 2021

Covid-19: global pandemic

- **age-specific**: death rates, behavior, externalities, policy impact
- emphasis on **testing** (uncertainty about infectious status)
- **behavioral change** through social distancing even w/o policy

New Version → New Results!

- added teleworking
- calibrated to statistical value of life
- computed optimal lockdown

→ optimal lockdown is quite strict & long and hugely welfare improving

- we **model** *behavior, incomplete information & age*
- benchmark: old shield themselves a lot; young less (death -80%)
- dynamic externality: more careful young *can* lead to more deaths of the old
→ but not relevant with vaccine arrival after 1.5 years.

Policy Insights

- **optimal lockdown**: starts very strict, lasts long (until vaccine), slow easing over time. Cuts deaths by factor 100, welfare improving for all.
- **other lockdowns not very effective**:
 - strict but short lockdown for all: **high welfare costs for the young**, few lives saved
 - mild and longer lockdown for all: moderately welfare-improving for all, but also **few lives saved**
 - lockdown of the old: saves lives but **decreases utility of old**
- **testing** works (death -50%)
- **testing+quarantines** better (up to -100%, young suffice)
- **separating activities by age** works (death -10%)

Literature

- Greenwood, Kircher, Santos and Tertilt (Econometrica 2019): first quantitative economic model of infectious diseases: adding choice to epidemiology. Context: HIV in Malawi.
- Eichenbaum, Rebelo and Trabandt (COVID): individual behavior, but no age.
- Acemoglu, Chernozhukov, Werning and Whinston (COVID) and Glover, Heathcote, Krueger and Jose-Victor Rios Rull (COVID): age, but no individual behavior.
→ matters for interpretation of “policy”. Our version: Should we restrict people beyond what they are voluntarily doing?
Others: no distinction between government policy vs. individual’s protecting themselves.

Model environment

Discrete time

Different ages (a): Young (y) and old (o)

Health status (j):

- healthy (h)
- “fever” (f): unsure whether Covid or common cold
- infected (i): recovery ($\phi(0)$) or serious symptoms (α)
- symptoms (s): recovery ($\phi(1)$) or death (δ_t)
- recovered (r): immune forever

Testing prob ξ_p (p for policy)

Death prob (δ_t): depends on availability of hospital beds

All of the above depend on age a

Vaccine available after 1.5 years

Households

Time: work outside n , telework v , leisure outside ℓ , leisure home d

Time constraint (TC): $n + v + \ell + d = 1$

Leisure goods outside the house g :

$$g(x, \ell) = [\theta x^\rho + (1 - \theta)\ell^\rho]^{1/\rho}$$

Preferences:

$$u(c, g, d; j, a, p) = \ln c + \gamma \ln g + \underbrace{[\lambda(j) + \lambda_p(j, a)]}_{\text{altruism/policy}} \ln(d) + b$$

Discount factor (with natural death prob): $\beta(a)$

Wages $w(a, n, v)$: $w[n + \tau(v)v]$ for the young and \bar{w} for the old

Teleworking: $\tau(v) = \tau_0 - \tau_1 v$, BC: $c + x = w(a, n, v)$

Infections

Covid:

$$\pi(n+\ell, \Pi_t(a)) = \underbrace{(n+\ell)}_{\text{Prob. entering common space}} \Pi_t(a)$$

Common cold:

$$\pi^*(n+\ell) = (n+\ell)\Pi^*$$

Covid transmission probability: (vaccine after 1.5 year)

$$\hat{\Pi}_t(a) = \Pi_0 \underbrace{\sum_{a', j \in \{f_i, i, s\}} (n_t(j, a') + \ell_t(j, a')) M_t(j, a')}_{\text{other infected per square meter}}$$

$$\Pi_t(a) = \underbrace{1 - e^{-\hat{\Pi}_t(a)}}_{\text{continuous time aggregation}}$$

Also consider selective mixing: some space reserved only for old

Summarizing how age matters in model

- Old do not work → spend naturally more time at home.
- COVID19 is more risky for them
 - Higher probability of becoming critically ill.
 - Once critically ill, higher chance of dying.→ Makes them further increase time at home voluntarily.
- Also higher chance of dying from “natural causes.”

Decision making (w/o testing): healthy people

$$\begin{aligned} V_t(h, a) = & \max_{c, x, n, v, \ell, d} u(c, g(x, \ell), d; h, a, p_t) + \\ & \beta(a)[1 - \pi_f(n + \ell, \Pi_t(a))] V_{t+1}(h, a) + \\ & \beta(a)\pi_f(n + \ell, \Pi_t(a)) V_{t+1}(f, a) \\ \text{s.t.} & \text{ (TC) and (BC).} \end{aligned}$$

Healthy:

$$\begin{aligned} V_t(h, a) = & \max_{c, x, n, v, \ell, d} u(c, g(x, \ell), d; h, a, p_t) + \\ & \beta(a)[1 - \pi_f(n + \ell, \Pi_t(a)) + \pi^*(n + \ell, \Pi_t(a))\xi_{p_t}(a)]V_{t+1}(h, a) + \\ & \beta(a)\xi_{p_t}(a)\pi(n + \ell, \Pi_t(a))V_{t+1}(i, a) + \\ & \beta(a)(1 - \xi_{p_t}(a))\pi_f(n + \ell, \Pi_t(a))V_{t+1}(f, a) \\ & \text{s.t. (TC) and (BC).} \end{aligned}$$

Decision making

Those **known to be infected** choose

- time at work, telework, time at home and leisure outside
- consumption and leisure goods

to maximize their life-time utility, taking into account:

- **that they want to (somewhat) protect others**
- **that they may become critically ill**
- time constraint
- budget constraint

Decision making

People with a fever choose

- time at work, telework, time at home and leisure outside
- consumption and leisure goods

to maximize their life-time utility, taking into account:

- that they may already have COVID19 (and how likely this is, given the aggregate prevalence rate in that week)
- that if they do have it, they want to (somewhat) protect others
- that if they don't have it, they may catch it
- time constraint
- budget constraint

If tested, they know immediately whether they have COVID19.

Decision making: Severely sick & Recovered

Severely sick

- don't choose anything
- don't work
- may die or recover
- can still infect others

Recovered

- assumed to be immune forever
- back to choosing consumption and time uses

Aggregation

Output: sum of wages

Laws of motion: as you would expect

Death prob: constant unless no hospital bed

A *rational-expectations equilibrium* in this economy with initial number of agents $M_0(j, a)$ consists of a sequence of infection and death rates $\{\Pi_t(a), \delta_t(a)\}_{t=0}^{\infty}$ and equilibrium time allocations $\{n_t(j, a), \ell_t(j, a)\}_{t=0}^{\infty}$ such that:

- these time allocations are part of the solutions to the *individual optimization* problems, and
- the resulting *laws of motion and their aggregation* indeed give rise to the sequence $\{\Pi_t(a), \delta_t(a)\}_{t=0}^{\infty}$.

- Calibrate to US economy
- Model period is a week
- Caveat: uncertainty about the data

Moments: Model vs. Data

| Moment | Model | Data (ranges) |
|---------------------------------------|----------|------------------|
| Common colds per year | 3 | 2-4 |
| R_0 , Covid-19 | 2.5 | 1.6-4 |
| % of infected in critical care, young | 3.33 | 3.33 |
| % of infected in critical care, old | 9.10 | 9.10 |
| % in critical care that dies, young | 14.2 | 5-24 |
| % in critical care that dies, old | 65.0 | 40-73 |
| Weeks in critical care, young | 3.5 | 3-6 |
| Weeks in critical care, old | 3.5 | 3-6 |
| Hours/day interacting while in ICU | 3.8 | 7.6 (controlled) |
| Life expectancy (natural), young | ∞ | 79 |
| Life expectancy (natural), old | 20 | 20 |

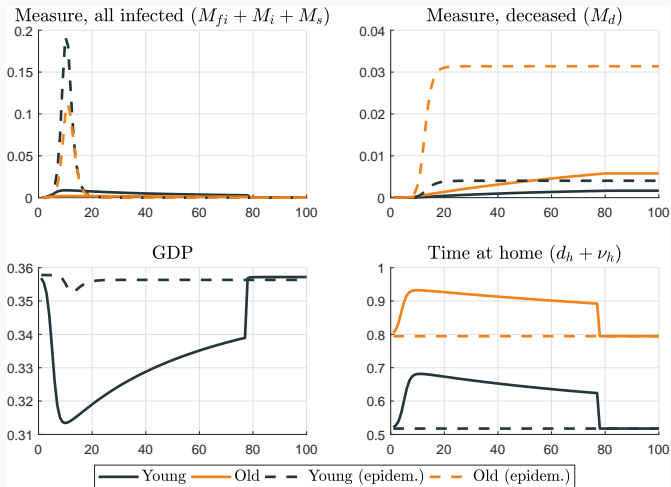
[◀ Back](#)

Moments: Model vs. Data continued

| Moment | Model | Data (ranges) |
|--|-------|---------------|
| Hours of work per week | 40 | |
| Hours of outside activities per week | 17.3 | 17.3 |
| % of income on goods outside | 12.5 | 11.1-16.1 |
| % ↑ in time @ home - mild symptoms | 50 | 50 (H1N1) |
| Replacement rate - social security, % | 60 | 46-64 |
| % of weekly hours in telework (normal times) | 8 | 8 |
| % ↓ in output w/ 36% of workers in telework | 10 | 10 |
| Value of a statistical life (in million USD) | 9.3 | 9.3 |

◀ Back

Benchmark results



Benchmark results

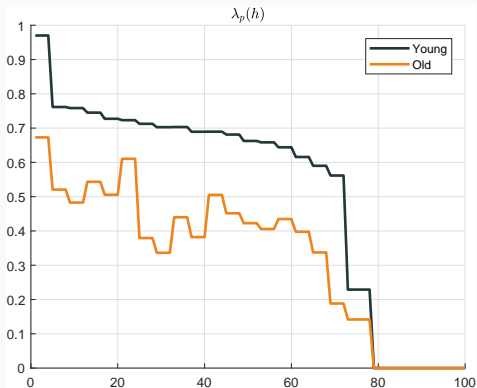
| | Benchmark | Epidemiological Model | No disease |
|-----------------------------|-----------|-----------------------|------------|
| Wks to peak srsly ill (yng) | 15.00 | 12.00 | |
| Wks to peak srsly ill (old) | 11.00 | 12.00 | |
| Dead p/ 1,000 1year (yng) | 1.22 | 4.04 | |
| Dead p/ 1,000 1year (old) | 4.03 | 31.40 | |
| Dead p/ 1,000 1year (all) | 1.82 | 9.89 | |
| Dead p/ 1,000 LR (yng) | 1.66 | 4.04 | |
| Dead p/ 1,000 LR (old) | 5.79 | 31.40 | |
| Dead p/ 1,000 LR (all) | 2.55 | 9.89 | |
| Immune in LR (yng), % | 35.12 | 85.29 | |
| Immune in LR (old), % | 8.67 | 45.81 | |
| Immune in LR (all), % | 29.46 | 76.84 | |
| GDP at peak - rel to BM | 1.00 | 1.13 | 1.14 |
| GDP 1year - rel to BM | 1.00 | 1.09 | 1.10 |
| Hrs @ home (yng) - peak | 76.29 | 57.97 | 57.97 |
| Hrs @ home (old) - peak | 104.44 | 88.99 | 88.99 |

Voluntary cautious behavior saves many many lives!

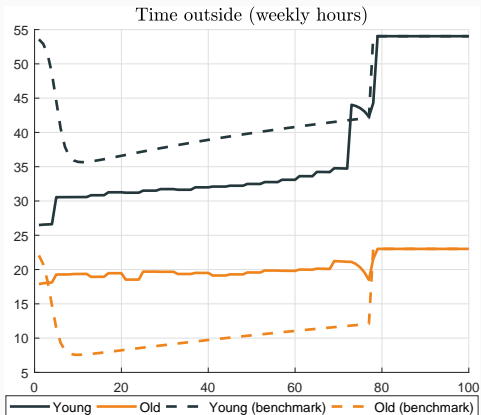
Policy experiments

- Measure “success of a policy” **relative to BM with voluntary reductions** in time outside.
- The choice of BM is important: Most lockdown policies are hugely welfare improving relative to epidemiological version of the model but much less so relative to BM.
- Distinguishes us from Acemoglu et al and Glover et al.

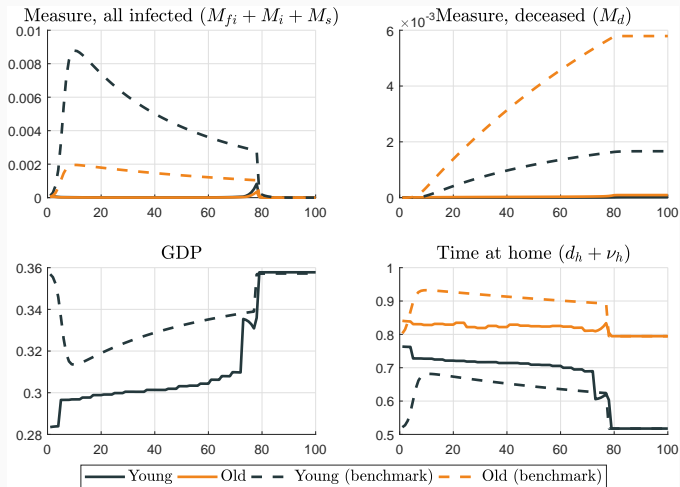
Optimal lockdown policy (in progress)



Optimal lockdown: Weekly Hours Outside



Optimal lockdown policy (in progress)



Optimal vs. other Lockdown Policies

| | Benchmark | Optimal Policy | strict & short | mild & longer | strict & long, old only |
|--------------------------------|-----------|----------------|----------------|---------------|-------------------------|
| Wks to peak srsly ill (yng) | 15.00 | 79.00 | 19 | 46 | 15 |
| Wks to peak srsly ill (old) | 11.00 | 79.00 | 24 | 43 | 40 |
| Dead p/ 1,000 LR (yng) | 1.66 | 0.02 | 1.49 | 1.24 | 1.65 |
| Dead p/ 1,000 LR (old) | 5.79 | 0.09 | 5.09 | 4.83 | 3.51 |
| Dead p/ 1,000 LR (all) | 2.55 | 0.03 | 2.26 | 2.01 | 2.05 |
| Immune in LR (yng), % | 35.12 | 0.32 | 31.5 | 26.3 | 34.9 |
| Immune in LR (old), % | 8.67 | 0.14 | 7.66 | 7.3 | 5.3 |
| Immune in LR (all), % | 29.46 | 0.28 | 2.64 | 22.2 | 28.6 |
| GDP at peak - rel to BM | 1.00 | 1.06 | 0.99 | 1.02 | 1.003 |
| GDP 1year - rel to BM | 1.00 | 0.92 | 0.98 | 0.97 | 1.001 |
| Cost p/ life saved, million \$ | - | 2.04 | 3.19 | 3.45 | none |
| Value - healthy (yng) | 9484.60 | 9496.00 | 9481.6 | 9487.4 | 9484.7 |
| Value - healthy (old) | 4337.20 | 4372.50 | 4337.7 | 4345 | 4318.9 |
| Value - healthy (all) | 8383.00 | 8399.60 | 8380.8 | 8386 | 8379.2 |

- May explain why there is so much political debate.
- All policies welfare improving relative to epidemiological model!
- Acemoglu et al argue that lockdown for the old is best policy – We disagree! (Old are a small and careful group with little externality on others, restricting them is either not binding or welfare-decreasing)

Test and Quarantine

| | Benchmark | Testing all | Q90-a-50t | Q90-a-100t | Q90-y-100t |
|-------------------------------|-----------|-------------|-----------|------------|------------|
| Wks to peak srsly ill (yng) | 15.00 | 28.00 | 25.00 | 3.00 | 3.00 |
| Wks to peak srsly ill (old) | 11.00 | 25.00 | 22.00 | 3.00 | 3.00 |
| Dead p/ 1,000 1year (yng) | 1.22 | 0.58 | 0.46 | 0.00 | 0.00 |
| Dead p/ 1,000 1year (old) | 4.03 | 2.33 | 1.97 | 0.01 | 0.01 |
| Dead p/ 1,000 1year (all) | 1.82 | 0.95 | 0.78 | 0.00 | 0.01 |
| Dead p/ 1,000 LR (yng) | 1.66 | 0.84 | 0.69 | 0.00 | 0.00 |
| Dead p/ 1,000 LR (old) | 5.79 | 3.40 | 2.94 | 0.01 | 0.01 |
| Dead p/ 1,000 LR (all) | 2.55 | 1.39 | 1.17 | 0.00 | 0.01 |
| Immune in LR (yng), % | 35.12 | 17.77 | 14.64 | 0.05 | 0.06 |
| Immune in LR (old), % | 8.67 | 5.11 | 4.42 | 0.02 | 0.02 |
| Immune in LR (all), % | 29.46 | 15.06 | 12.45 | 0.04 | 0.05 |
| Max. n. of tests in a week, % | 0.00 | 4.72 | 2.36 | 4.76 | 4.27 |
| GDP at peak - rel to BM | 1.00 | 1.07 | 1.09 | 1.14 | 1.14 |
| GDP 1year - rel to BM | 1.00 | 1.05 | 1.06 | 1.10 | 1.10 |
| GDP gain per test, 1 year, \$ | - | 1431.00 | 3286.90 | 2282.60 | 2540.10 |
| Value - healthy (yng) | 9484.60 | 9494.20 | 9495.70 | 9502.70 | 9502.70 |
| Value - healthy (old) | 4337.20 | 4355.60 | 4358.70 | 4373.40 | 4373.40 |
| Value - healthy (all) | 8383.00 | 8394.50 | 8396.40 | 8405.00 | 8405.00 |

Summarizing

- Voluntary activity reductions: 80% less deaths, driven by old.
- Lockdowns have many pitfalls (may save only few lives at substantial cost, may hurt the young or the old).
- Optimal lockdown: reduces activity by young, not old!
Reduces deaths by factor 100 at sizeable GDP cost (8% decline in first year), but hugely welfare improving.

What else? Testing:

- testing all and no quarantine: 50% less deaths (GDP↑ 5%)
- testing 50% and quarantine: 60% less death (GDP↑ 6%)
- testing all and quarantine: very few cases (GDP↑ 10%)

- Hospital bed (ICU) constraints (make lockdown policies even more desirable)
- Without teleworking (lockdowns a lot more costly)
- Later vaccine arrival (in limit, no point of lockdown)

Other caveats

- Uncertainty regarding calibration
- No asymptomatic cases
- Immediate test results

Appendix

Parameters - disease

| Parameter | Value | Interpretation |
|--------------|--------|---|
| | 0.214 | Fraction of old in Population |
| Π^* | 0.113 | Weekly infectiousness of common cold/flu |
| Π_0 | 13.425 | Infectiousness of Covid-19 |
| α | 1 | Prob(serious symptoms no recovery from mild) |
| $\phi(0, y)$ | 0.983 | Prob of recovering from mild Covid-19, young |
| $\phi(0, o)$ | 0.954 | Prob of recovering from mild Covid-19, old |
| $\phi(1, y)$ | 0.284 | Prob of recovering from serious Covid-19, young |
| $\phi(1, o)$ | 0.284 | Prob of recovering from serious Covid-19, old |
| $\bar{\ell}$ | 0.158 | Infections through the health care system |
| $\delta(y)$ | 0.065 | Weekly death rate (among critically ill), young |
| $\delta(o)$ | 0.738 | Weekly death rate (among critically ill), old |
| $\Delta(y)$ | 1 | Weekly survival (natural causes), young |
| $\Delta(o)$ | 0.999 | Weekly survival (natural causes), old |
| T^* | 78 | One and a half year (78 weeks) to vaccine arrival |

Parameters - Economic & Preferences

| Parameter | Value | Interpretation |
|-----------------|---------------|--|
| ρ | -1.72 | Elasticity of subst. bw leisure time and goods |
| θ | 0.033 | Production of leisure goods |
| γ | 0.635 | Rel. utility weight - leisure goods |
| λ_d | 1.56 | Rel. utility weight - leisure at home |
| $\lambda(i)$ | 1.068 | Rel. utility weight - leisure at home (infected) |
| b | 11 | Flow value of being alive |
| $\tilde{\beta}$ | $0.96^{1/52}$ | Discount factor |
| w | 1 | Wage per unit of time |
| τ_0 | 1.055 | Parameter related to telework productivity |
| τ_1 | 0.960 | Parameter related to telework productivity |
| \bar{w} | 0.214 | Retirement income |