

# Health versus Wealth: On the Distributional Effects of Controlling a Pandemic

---

Andrew Glover   Jonathan Heathcote   Dirk Krueger   José-Víctor Ríos-Rull

Banco Central de Chile

May 20 2020

Federal Reserve Bank of Kansas City

Federal Reserve Bank of Minneapolis and CEPR

University of Pennsylvania, CEPR, CFS, NBER and Netspar

University of Pennsylvania, CAERP, UCL, CEPR and NBER

The Views Expressed Herein are Those of the Authors and Not Necessarily Those of the Federal Reserve Banks of Kansas City or Minneapolis or the Federal Reserve System

# Introduction

---

- What is the appropriate economic policy response to the pandemic?
- How extensive should the shut-down be, and when should it end?
- Key item: Large distributional implications of lock down policies.
  - Benefits are concentrated among the old
  - Costs are concentrated among the young and especially, the young who face unemployment
- Need some combination of shut-down and redistribution

- Build an epidemiological/economic model with heterogeneous agents
- Assume that transfers across agents are **costly**
- Assess two policies
  - Mitigation (less output but also less contagion)
  - Redistribution toward those whose jobs are shuttered
- Characterize optimal policy
- Interaction:
  - Mitigation creates the need for redistribution
  - If redistribution is costly, reduces the incentives for mitigation
  - Need heterogeneous agent model to analyze this trade-off.

# EPIDEMIOLOGY: THE SAFER SIR MODEL

- Stage of the disease
  - **S**usceptible
  - Infected **A**symptomatic
  - Infected with **F**lu-like symptoms
  - Infected and needing **E**mergency hospital car
  - **R**ecovered (and **D**ead)
- Worst case disease progression:  $S \rightarrow A \rightarrow F \rightarrow E \rightarrow D$
- But recovery is possible at each stage
- Three infected types spread virus in different ways:
  - **A** at work, while consuming, at home
  - **F** at home
  - **E** to health-care workers

# ECONOMICS: HETEROGENEITY BY AGE AND SECTOR

- Age  $i \in \{y, o\}$ 
  - Only young work
  - Old have more adverse outcomes conditional on contagion
  - But young more prone to contagion (they work)
  - Old discount future at higher rate, reflecting shorter life expectancy
- Sector of production  $\{b, \ell\}$ 
  - Basic (health care/food production/law enforcement/government)
    - Will never want shut-downs in this sector
    - Workers in this sector care for the hospitalized
  - Luxury (restaurants, entertainment etc.)
    - Government chooses what fraction  $m$  of this sector to shutter
    - Workers face shutdown unemployment risk
    - But they are less likely to get infected

# INTERACTIONS BETWEEN HEALTH AND WEALTH

- Shutdown (Mitigation)
  - Reduces contagion
  - Reduces risk of hospital overload
  - Reduces average consumption
  - Increases inequality (more unemployment)
- Redistribution
  - Helps the unemployed  $\Rightarrow$  makes mitigation more palatable
  - But redistribution is costly  $\Rightarrow$  makes mitigation more expensive
- What policies do different types prefer?
- How does the utilitarian optimal policy vary with the cost of redistribution?

- Lifetime utility (for old)

$$E \left\{ \int e^{-\rho_o t} \left[ u(c_t^o) + \bar{u} + \hat{u}_t^j \right] dt \right\}$$

- $\rho_o$ : time discount rate
  - $u(c_t^o)$  instantaneous utility from old age consumption  $c_t^o$
  - $\bar{u}$ : value of life
  - $\hat{u}_t^j$ : intrinsic (dis)utility from health status  $j$  (zero for  $j \in \{s, a, r\}$ )
- 
- Differences in expected longevity through  $\rho_y \neq \rho_o$  (no aging)



- Young permanently assigned to  $b$  or  $\ell$
- Linear production: output equals number of workers
- Only workers with  $j \in \{s, a, r\}$  work
- Output in basic sector:

$$y^b = x^{ybs} + x^{yba} + x^{ybr}$$

- Output in luxury sector is

$$y^\ell = [1 - m] (x^{y\ell s} + x^{y\ell a} + x^{y\ell r})$$

- Total output given by

$$y = y^b + y^\ell.$$

- Fixed amount of output  $\eta\Theta$  spent on emergency health care
- $\Theta$  measures capacity of emergency health system,  $\eta$  its unit cost

- Types of transmission
  - **w**ork: young workers infected by **A** workers, prob  $\beta_w(m)$
  - **c**onsumption: young & old infected by **A** shoppers, prob  $\beta_c(m) \times y(m)$
  - **h**ome: young & old infected by **A** and **F** family, prob  $\beta_h$
  - **e**mergency: basic workers infected by **E**, prob  $\beta_e$
- infection-generating rates  $\beta_w(m)$  &  $\beta_c(m)$  depend on extent of mitigation:

$$\beta_w(m) = \alpha_w \left[ \frac{y^b + y^\ell(m)(1 - m)}{y(m)} \right]$$

- Similar for  $\beta_c(m)$
- Micro-founded via sectoral heterogeneity in social contact rates
- Smart mitigation shuts most contact-intensive sub-sectors first

## FLOW INTO ASYMPTOMATIC (OUT OF SUSCEPTIBLE)

$$\dot{x}^{ybs} = - \left[ \beta_w(m) \quad \left[ x^{yba} + (1-m)x^{y\ell a} \right] + \beta_c(m)y(m)x^a + \beta_h(x^a + x^f) + \beta_e x^e \right] x^{ybs}$$

$$\dot{x}^{y\ell s} = - \left[ \beta_w(m)(1-m) \quad \left[ x^{yba} + (1-m)x^{y\ell a} \right] + \beta_c(m)y(m)x^a + \beta_h(x^a + x^f) \right] x^{y\ell s}$$

$$\dot{x}^{os} = - \left[ \quad \quad \quad \beta_c(m)y(m)x^a + \beta_h(x^a + x^f) \right] x^{os}$$

- Shutdowns (mitigation) reduce infections by:
  - Reducing number of workers  $\Rightarrow$  less workplace transmission
  - Reducing output  $y(m) \Rightarrow$  less consumption transmission
  - No impact on home or hospital transmission

## FLOWS INTO OTHER HEALTH STATES

- For each type  $j \in \{yb, yl, o\}$

$$\dot{x}^{ja} = -\dot{x}^{js} - (\sigma^{jaf} + \sigma^{jar}) x^{ja}$$

$$\dot{x}^{jf} = \sigma^{jaf} x^{ja} - (\sigma^{jfe} + \sigma^{jfr}) x^{jf}$$

$$\dot{x}^{je} = \sigma^{jfe} x^{jf} - (\sigma^{jed} + \sigma^{jer}) x^{je}$$

$$\dot{x}^{jr} = \sigma^{jar} x^{ja} + \sigma^{jfr} x^{jf} + (\sigma^{jer} - \varphi) x^{je}$$

$$\varphi = \lambda_o \max\{x^e - \Theta, 0\}.$$

- where all the flow rates  $\sigma$  vary by age
- $x^e - \Theta$  measures excess demand for emergency health care. Reduces flow of recovered (Increases flow into death)

## REDISTRIBUTION

- Costly transfers between workers, non-workers (old, sick, unemployed)
- Utilitarian planner: taxes/transfers don't depend on age/sector/health
  - Workers share common consumption level  $c^w$
  - Non-workers share common consumption level  $c^n$
- Define measures of non-working and working as

$$\mu^n = x^{y\ell f} + x^{y\ell e} + x^{ybf} + x^{ybe} + m(x^{y\ell s} + x^{y\ell a} + x^{y\ell r}) + x^o$$

$$\mu^w = x^{ybs} + x^{yba} + x^{ybr} + [1 - m](x^{y\ell s} + x^{y\ell a} + x^{y\ell r})$$

$$\nu^w = \frac{\mu^w}{\mu^w + \mu^n}$$

- Aggregate resource constraint

$$\mu^w c^w + \mu^n c^n + \mu^n T(c^n) = y - \eta\Theta = \mu^w - \eta\Theta$$

- where  $T(c^n)$  is per-capita cost of transferring  $c^n$  to non-workers

## INSTANTANEOUS SOCIAL WELFARE FUNCTION

- Consumption allocation does not affect disease dynamics  $\Rightarrow$  optimal redistribution is a static problem
- With log-utility and equal weights, the period social welfare is

$$W(x, m) = \max_{c^n, c^w} [\mu^w \log(c^w) + \mu^n \log(c^n)] + (\mu^w + \mu^n) \bar{u} + \sum_{i,j \in \{f,e\}} x^{ij} \hat{u}^j$$

- Maximization subject to resource constraint gives  $\frac{c^w}{c^n} = 1 + T'(c^n)$ .

## INSTANTANEOUS SOCIAL WELFARE FUNCTION

- Assume  $\mu^n T(c^n) = \mu^w \frac{\tau}{2} \left( \frac{\mu^n c^n}{\mu^w} \right)^2$
- Optimal allocation

$$c^n = \frac{\sqrt{1 + 2\tau \frac{1-\nu^2}{\nu} \tilde{y}} - 1}{\tau \frac{1-\nu^2}{\nu}}$$
$$c^w = c^n(1 + T'(c^n)) = c^n \left( 1 + \tau \frac{1-\nu}{\nu} c^n \right)$$

where  $\tilde{y} = \nu - \frac{\eta\Theta}{\mu^w + \mu^n}$ .

- $\left( 1 + \tau \frac{1-\nu}{\nu} c^n \right)$  is the effective marginal cost of transfers.
- It increases with  $c^n$  and  $\tau$ , decreases with share of workers  $\nu$
- Higher mitigation  $m$  reduces  $\nu$ , thus increases marginal cost
- $\Rightarrow$  policy interaction between  $m, \tau$ .

## Mapping to Data

---



## CALIBRATION: PREFERENCES:

- $u(c) = \log(c)$
- Young  $< 65$  (85% of population), Old  $\geq 65$
- $\rho_y = 4\%$  and  $\rho_o = 10\%$ : pure discount rate of 3% plus adjustment for 47.5 & 14 years of residual life expectancy
- $\bar{u} = 11.4 - \log(\bar{c})$ : VSL is \$11.5m  $\Rightarrow$  \$515k flow value or  $11.4 \times$  US cons. pc
  - Static trade-off: pay 10.8% of cons. to avoid 1% death probability
  - Dynamic: give up 25% of cons. for 6 months for 0.16% increase in chance of living 10 more years
- $\hat{u}^f, \hat{u}^e$ : flu reduces baseline utility by 30%, hospital by 100%

## CALIBRATION: DISEASE PROGRESSION (IMPERIAL MODEL)

1. Avg. duration asymptomatic: 5.3 days
    - 50% recover (important unknown)
    - 50% develop flu
  2. Avg. duration of flu: 10 days
    - 96% of young recover
    - 75% of old recover
    - rest move to emergency care
  3. Avg. duration of emergency care: 8 days
    - 95% of young recover (absent overcapacity)
    - 80% of old recover (absent overcapacity)
    - rest die
- These moments pin down all the  $\sigma$  parameters
  - Implied death rates (absent overuse) 2.5% for the old, 0.1% for young

- Production
  - Size of basic Sector: 45%
    - basic = health, agriculture, utilities, finance, federal govt
    - luxury = manuf., constr., mining, educ., leisure & hospitality
    - split the rest similarly
  - $\Theta = 0.042\%$  (100,000 beds),  $\lambda_o$  s.t. mortality up 20% at infection peak
- Redistribution
  - Marginal excess burden 38% pre-COVID ( $\tau = 3.5$ , Saez, Slemrod, Giertz 2012)
  - $\Rightarrow$  planner chooses  $\frac{c^n}{c^w} = \frac{1}{1.38}$
- Mitigation time path

$$m(t) = \frac{\gamma_0}{1 + \exp(-\gamma_1(t - \gamma_2))}$$

## CALIBRATION: VIRUS TRANSMISSION

- Set  $\alpha_w/\beta_h$ ,  $\alpha_c/\beta_h$  to match evidence on number of potentially infectious contacts Mossong et al. (2008)
  - 35% of transmission occurs in workplaces and schools (model work)
  - 19% occur in travel and leisure activities (model consumption)
- Set  $\beta_e$  so that 5% of infections are to health care workers as of April 12, 2020
- $\beta_h$  then determines basic reproduction number  $R_0$  (next slides)

## CALIBRATION: INITIAL CONDITIONS

- Will focus on alternative mitigation policies starting from **April 12**
- But how many people are already infected? How fast is the virus spreading?
- Data challenges:
  - Estimates of COVID-19  $R_0$  from early days in Wuhan are outdated: behaviors and policies have changed drastically
  - Limited testing  $\Rightarrow$  positive test counts understate true infection levels
  - Hardest numbers we have are for deaths (even those under-counted)

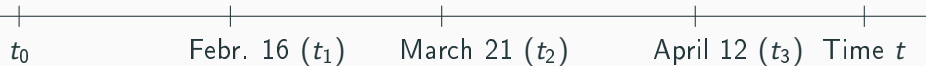
## OUR STRATEGY

- Assume initial arrival of infected individuals on Feb 12
- Assume America changed on **March 21**
  - ① One-time proportional drop in infection-generating rates  $\alpha_w, \alpha_c, \beta_h$   
 $\Rightarrow R_0$  falls
  - ②  $m = 0 \rightarrow m = 0.5 \Rightarrow 27.7\%$  fall in employment (consistent with Faria-e-Castro (2020) and Bick & Blandin (2020))
- Set infection-generating rates pre-and post March 21 and Feb 12 infected population to match NY Times deaths data:
  - ① Cumulative deaths on March 21: **343**
  - ② Cumulative deaths on April 12: **22,055**
  - ③ Daily death toll around April 12: **1,632**

# CALIBRATION: INITIAL CONDITIONS AND $R_0$

**Target**       $I_{t_1} = 12$        $D_{t_2} = 343$        $D_{t_3} = 22,055$   
 $D_{t_3} - D_{t_3-1} = 1,632$

**Parameter**       $R_{t_1} = 3.61$        $R_{t_2} = 1.02$ , under  $m_{t_2} = 0.5$



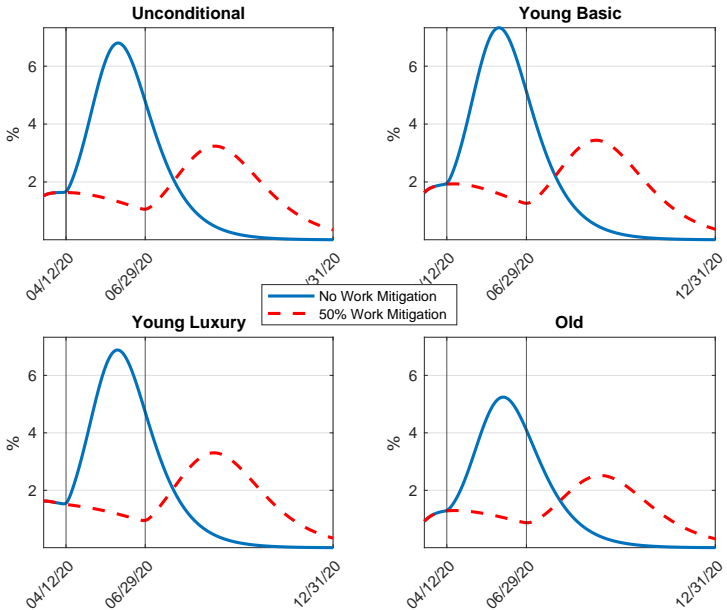
Millions of People in Each Health State

	S	A	F	E	R	D $\times$ 1000
03/21/20	323.71	4.17	0.84	0.01	1.27	0.34
04/12/20	311.31	2.95	2.72	0.12	12.88	22.1

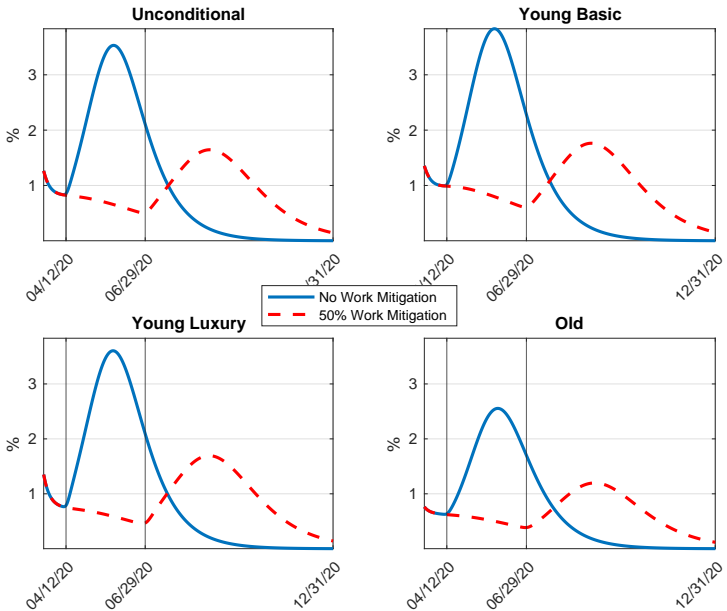
- 1 Baseline comparison:  $\gamma_0 = 0.5$ ,  $\gamma_1 = -0.5$ ,  $\gamma_2 = \text{March 21} + 100$  (mitigation ends around June 29), vs. no mitigation from April 12
- 2 Alternative severity:  $\alpha_0 = 0.75, 0.25$
- 3 Optimize (starting April 12) over  $\gamma_0, \gamma_1, \gamma_2$ 
  - For each policy, compute welfare gains rel. to no mitigation by type
  - How do gains from mitigation vary with cost of redistribution  $\tau$ ?
  - How does optimal mitigation vary with cost of redistribution?



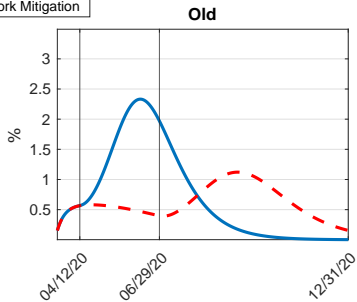
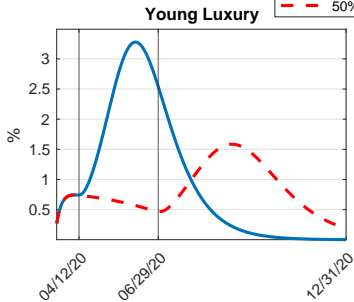
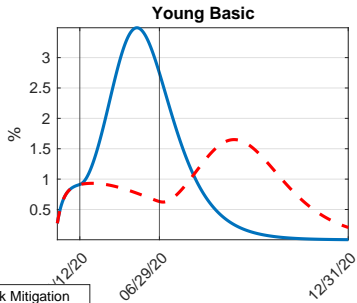
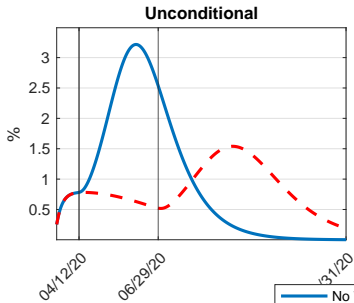
# SHARES CURRENTLY INFECTED



# SHARES ASYMPTOMATIC

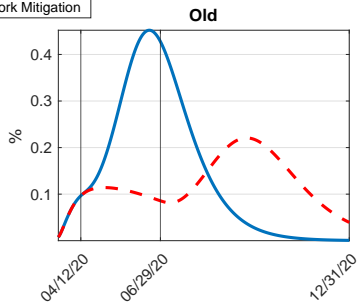
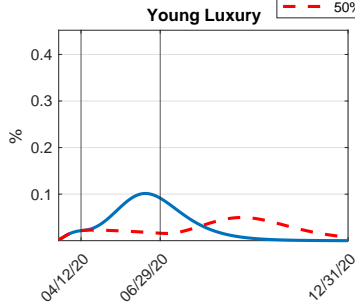
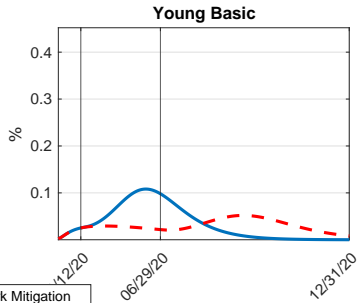
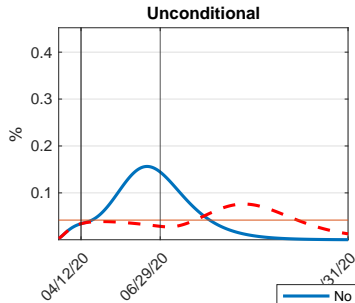


# SHARES WITH FLU SYMPTOMS



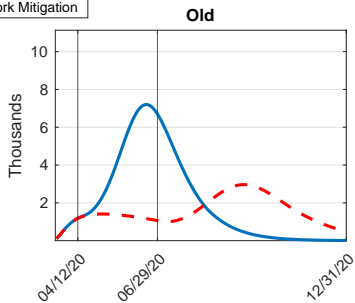
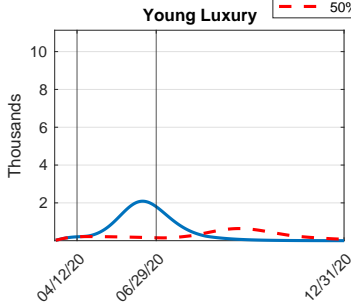
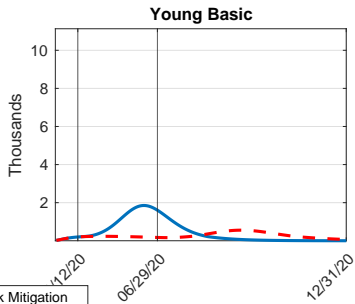
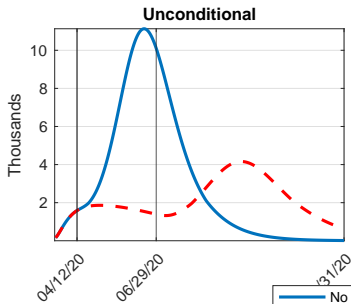
— No Work Mitigation  
- - 50% Work Mitigation

# SHARES HOSPITALIZED

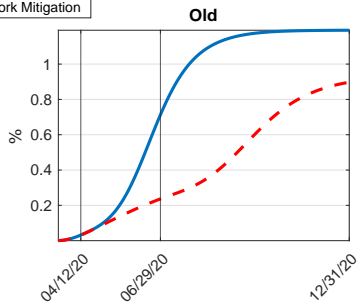
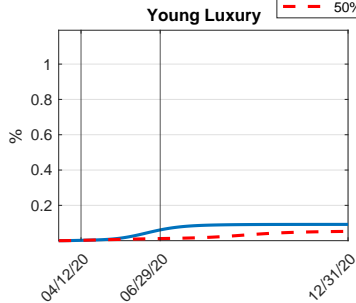
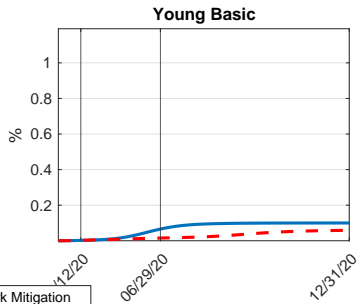
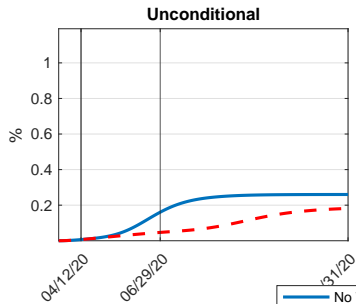


— No Work Mitigation  
- - 50% Work Mitigation

# NUMBER OF DEATHS

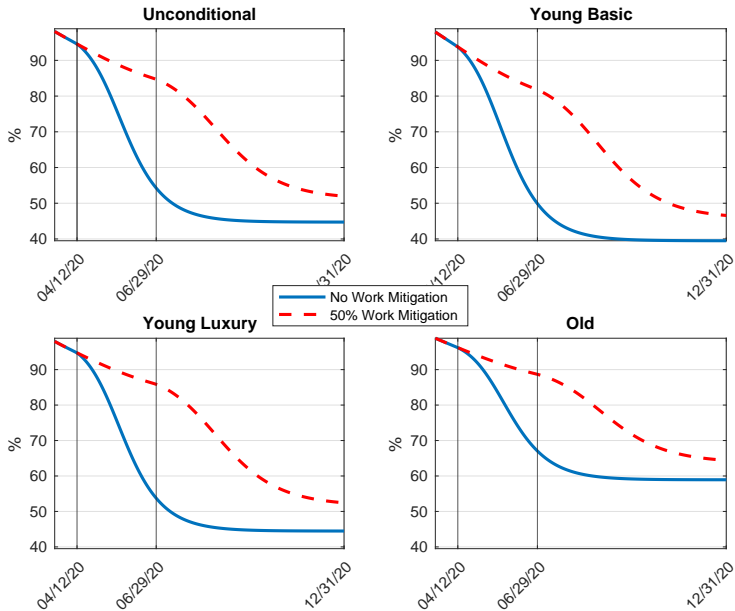


# CUMULATIVE DEATHS

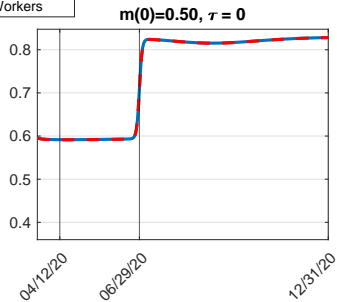
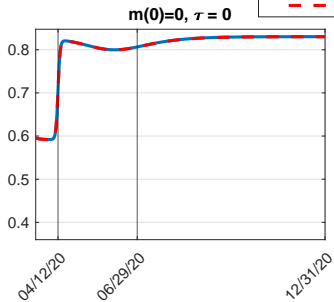
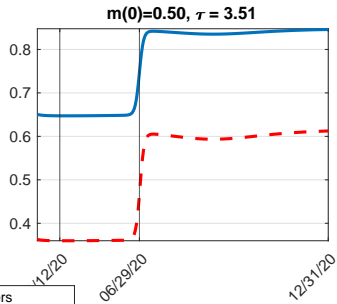
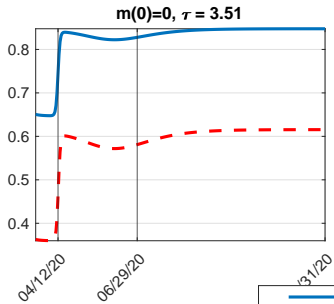


— No Work Mitigation  
- - 50% Work Mitigation

# SHARES NEVER INFECTED



# CONSUMPTION





## MILLIONS OF PEOPLE IN EACH HEALTH STATE

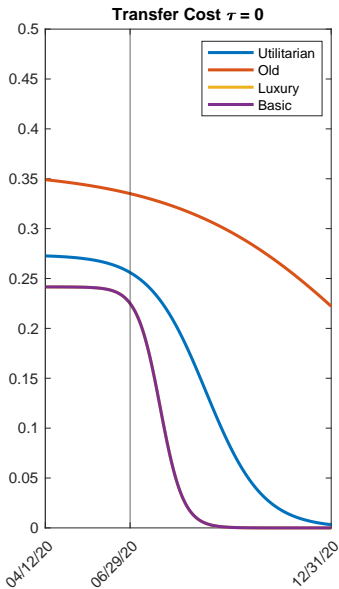
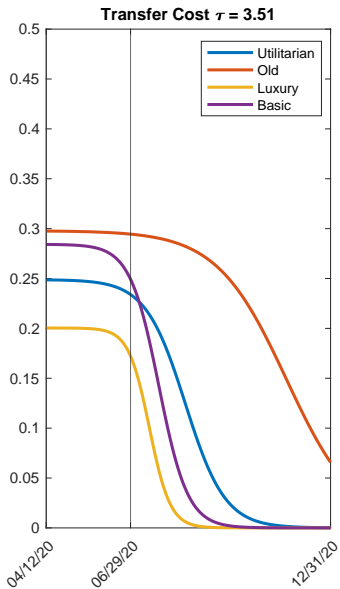
	S	A	F	E	R	D × 1000
03/21/20	323.71	4.17	0.84	0.01	1.27	0.34
04/12/20	311.31	2.95	2.72	0.12	12.88	22.1
04/30/20	303.11	2.57	2.53	0.13	21.60	53.38
06/29/20	249.42	1.68	1.72	0.09	46.86	154.81
09/30/20	201.42	4.31	4.59	0.24	119.03	406.81
12/31/20	171.52	0.47	0.62	0.04	156.74	599.38
12/31/21	168.82	0.00	0.00	0.00	160.56	621.95

## WELFARE GAINS (+) OR LOSSES (-) FROM MITIGATION

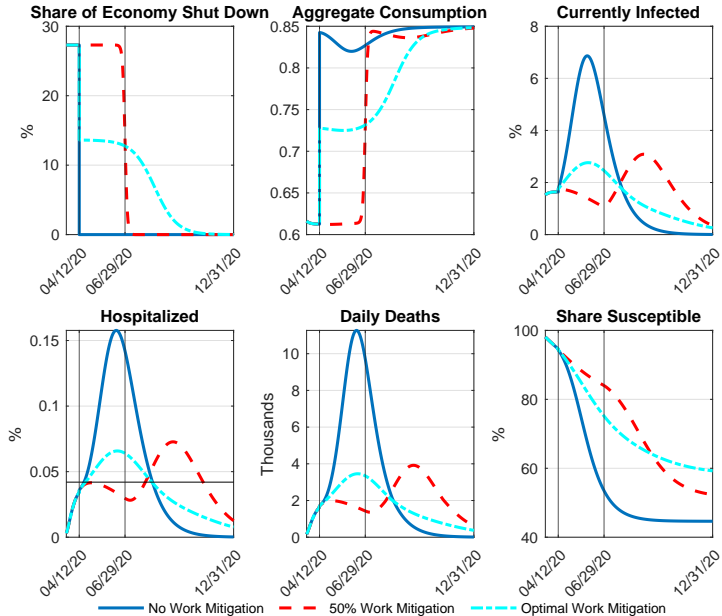
Mitigated Share	75%		50%		25%	
Transfer Cost ( $\tau$ )	3.51	0.001	3.51	0.001	3.51	0.001
Young Basic	0.06%	-0.04%	0.24%	0.18%	0.33%	0.30%
Young Luxury	-0.37%	-0.05%	-0.01%	0.16%	0.23%	0.29%
Old	1.44%	2.00%	2.17%	2.64%	2.60%	2.93%

# OPTIMAL POLICIES

## Preferred Mitigation Functions



# OUTCOME COMPARISONS



## WELFARE GAINS UNDER OPTIMAL POLICIES

Welfare Gains (+) or Losses (-) From Preferred Mitigation,  $\tau = 3.51$

	Utilitarian	Old	Young Luxury	Young Basic
Young Basic	0.36%	0.29%	0.34%	0.36%
Young Luxury	0.21%	-0.05%	0.25%	0.22%
Old	3.60%	4.15%	2.89%	3.37%

Welfare Gains (+) or Losses (-) From Preferred Mitigation,  $\tau \approx 0$

	Utilitarian	Old	Young Luxury	Young Basic
Young Basic	0.30%	-0.05%	0.32%	0.32%
Young Luxury	0.29%	-0.06%	0.32%	0.32%
Old	4.49%	5.30%	3.68%	3.68%

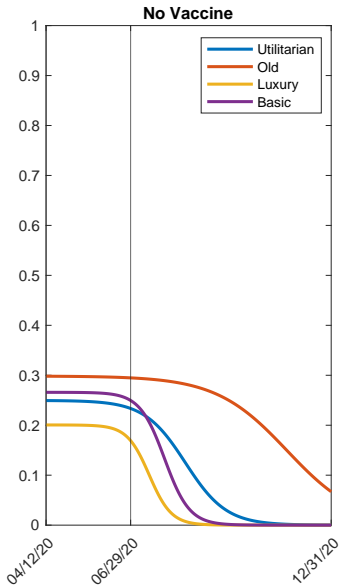
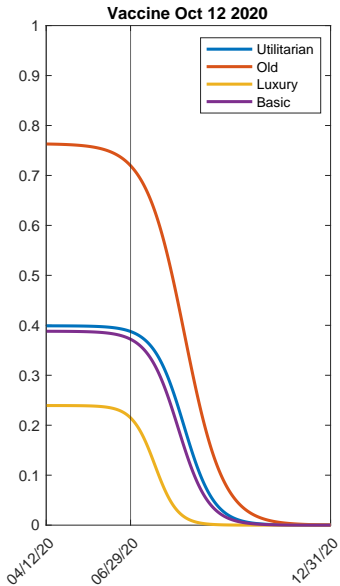
**What if there is a Vaccine?**

---

- We now put on our optimist hats - assume that a vaccine is readily available on Oct 12, 2020
- This ends new infections
- Sickness and deaths last a bit longer
- Key: infections end before herd immunity is reached

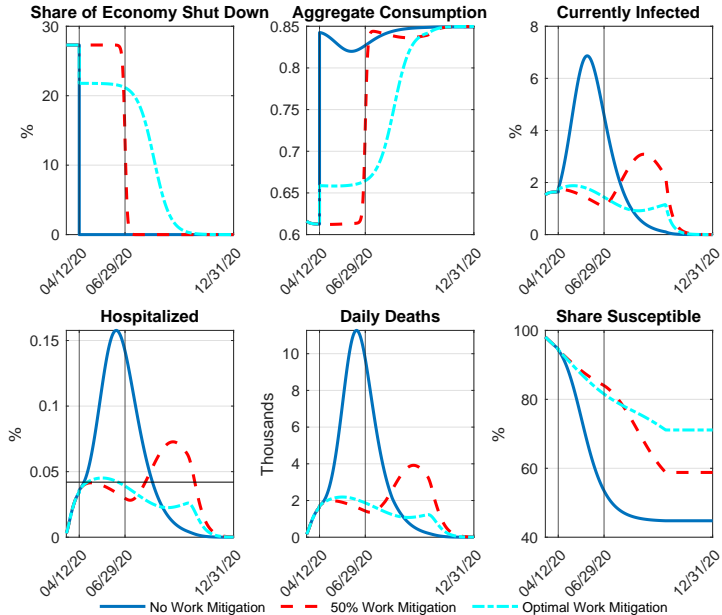
# OPTIMAL POLICIES COMPARISON WITH/WITHOUT VACCINE

## Preferred Mitigation Functions





# OUTCOMES WITH VACCINE ARRIVING OCT. 12

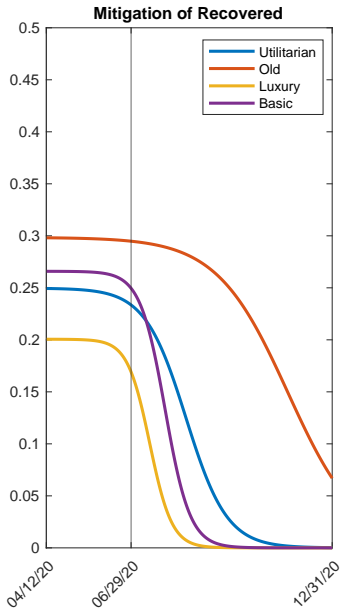
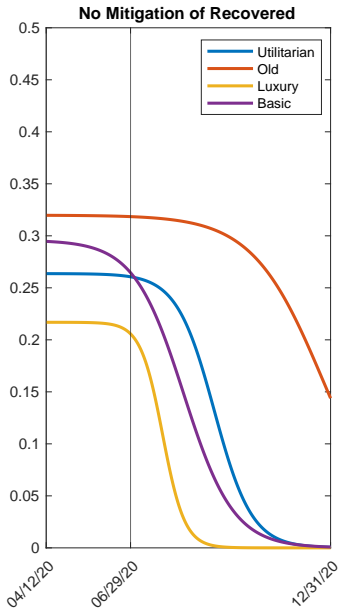


**What If Recovered Can Go Back  
to Work?**

---

- In the last month, antibody tests are becoming available
- With widespread antibody testing, the recovered can be given immunity passports and avoid mitigation
- Optimal mitigation higher than without antibody tests

# OPTIMAL MITIGATION WITH IMMUNITY PASSPORTS



# WELFARE GAINS FROM ANTIBODY TESTS

Policy Form	Utilitarian		Old		Luxury		Basic	
	Tests	No Tests	Tests	No Tests	Tests	No Tests	Tests	No Tests
Young Basic	0.38%	0.36%	0.32%	0.29%	0.36%	0.34%	0.39%	0.36%
Young Luxury	0.23%	0.21%	0.01%	-0.05%	0.28%	0.25%	0.24%	0.22%
Old	3.91%	3.60%	4.39%	4.15%	3.13%	2.89%	3.72%	3.37%

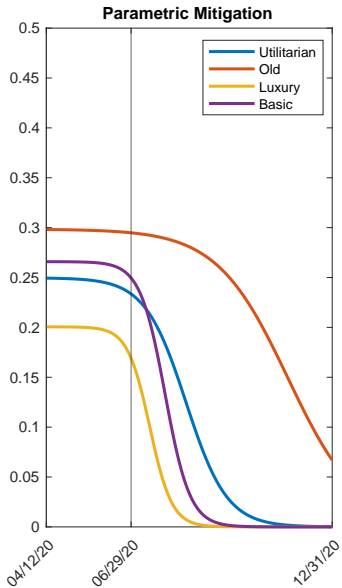
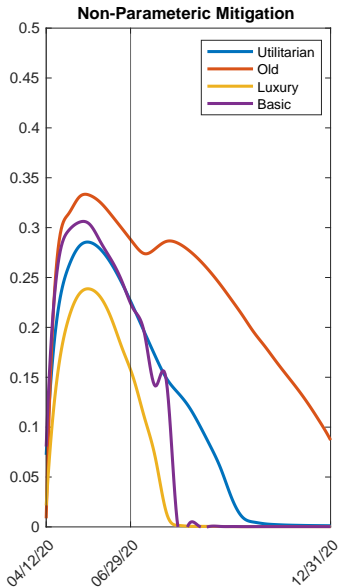
# Could We Do Better With More Flexible Policies?

---

- Our parametric mitigation function is simple to implement.
- Now allow for a fully flexible path for  $m$
- Set up optimal control problem, solve for each group's preferred non-parametric policy
- Lots of computer time, very small marginal gains!

# OPTIMAL NON-PARAMETRIC VS SIMPLE POLICIES

Preferred Mitigation Functions

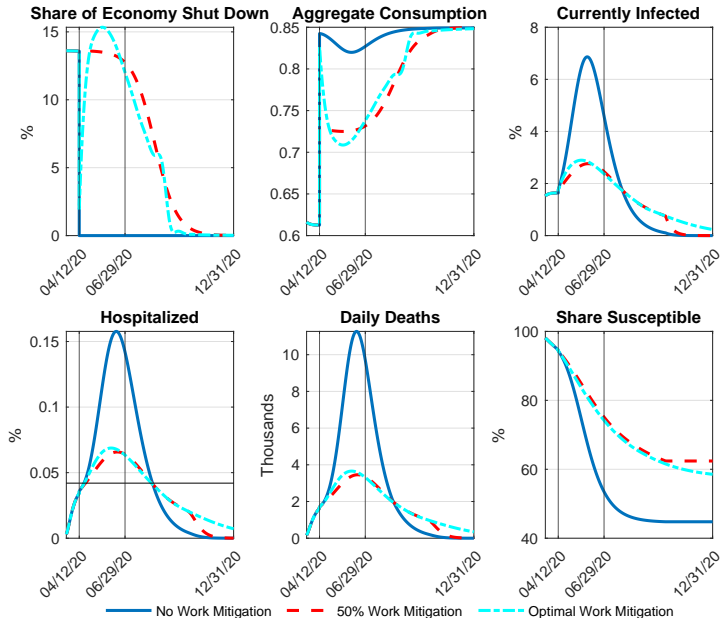




# WELFARE GAINS WITH NON-PARAMETRIC VS SIMPLE POLICIES

Policy Form $\tau$	Utilitarian		Old		Luxury		Basic	
	Non-Par	Par	Non-Par	Par	Non-Par	Par	Non-Par	Par
Young Basic	0.36%	0.36%	0.29%	0.29%	0.34%	0.34%	0.37%	0.36%
Young Luxury	0.22%	0.21%	-0.04%	-0.05%	0.25%	0.25%	0.23%	0.22%
Old	3.62%	3.60%	4.15%	4.15%	2.89%	2.89%	3.26%	3.37%

# OUTCOMES WITH NON-PARAMETRIC VS SIMPLE POLICIES



## CONCLUSIONS

- Current baseline simulation suggests current shutdowns should be partially relaxed but extended
- Welfare gains are uneven: large for the old, small for the young
- Cost of redistribution matters: harder shutdown optimal when redistribution is costless
- Results sensitive to parameters:
  - Value of life
  - Importance of economic activity in disease transmission
  - Disease lethality
  - Timing of vaccine arrival
  - Reading of current state: how many infections? how fast spreading?