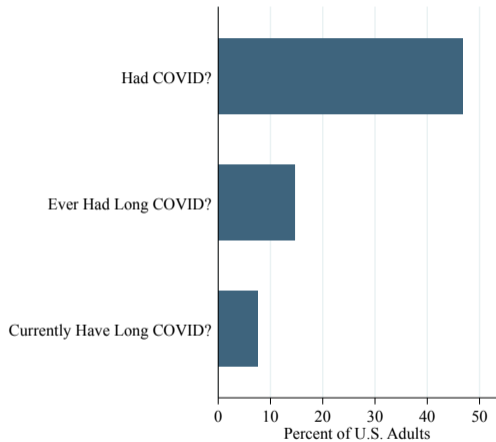


The Impacts of Covid-19 Illnesses on Workers

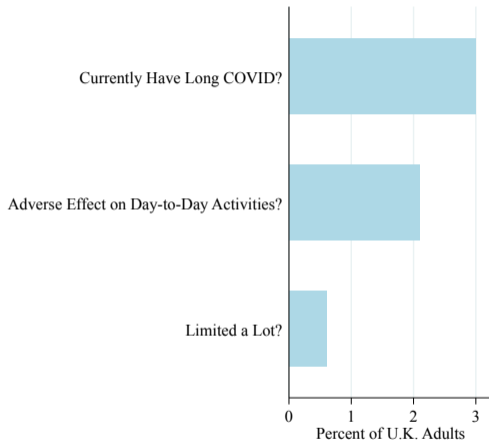
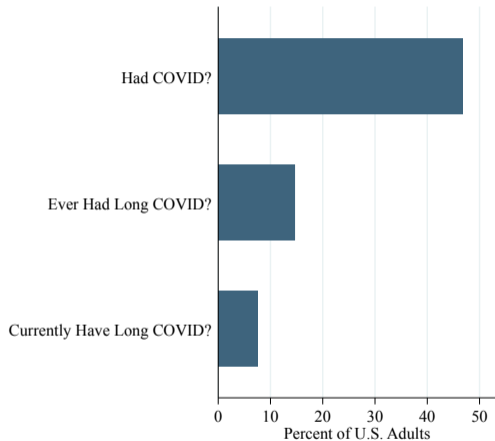
Gopi Shah Goda, SIEPR/NBER
Evan J. Soltas, MIT

July 2022

Rates of Long Covid in the U.S. and the U.K.



Rates of Long Covid in the U.S. and the U.K.



Sources: U.S. Census Bureau, Household Pulse Survey, June 2022; U.K. Office for National Statistics, July 2022

Long covid is destroying careers, leaving economic distress in its wake

Economies face 'long COVID' threat as data shows rates surging

Where Are the Workers? Millions Are Sick With 'Long Covid.' Germany: Long COVID a problem for labor market, health minister says

How much of our labor force has been lost to COVID-19?

Long Covid Is Showing Up in the Employment Data

Covid-19, Endemic or Not, Will Still Make Us Poorer

Long Covid: the invisible public health crisis fuelling labour shortages

Is Long Covid to blame for our army of absent workers?

Long Covid now major cause of long-term job absence, say quarter of UK employers

Research Questions

- ① What is the impact of Covid-19 illness on labor supply?
- ② How much of an aggregate labor supply loss can be explained by prior Covid-19 illness?

What Do We Know?

Existing evidence:

- Surveys of long Covid patients suggest employment rate is ~ 20 p.p. lower after illness (Davis et al., 2021; Evans et al., 2021; Ziauddeen et al., 2022)
- Rough calculations using survey data imply labor force losses of >1 M people (Bach, 2022; Domash and Summers, 2022; Cutler and Summers, 2022)

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Solution: Follow workers with health-related work absences in Current Population Survey (CPS) over time using an event-study approach and scale up

Summary of Results

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- Estimate labor force loss of 500,000–900,000 workers (0.2%–0.3% of adults)
- Forgone-earnings burden of illness is about half of cancer or diabetes

Related Research

- Broader literature on economic costs of health shocks:
Hospitalization (García-Gómez et al., 2013; Dobkin et al., 2018; Stepner, 2019); Cancer (Gupta et al., 2017); Severe chronic mental health issues (Biasi et al., 2021); Denial of abortion (Miller et al., 2020)

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- Large-scale retrospective-cohort studies on the longer-term impacts of Covid-19 illness on health-related outcomes:
Kidney outcomes (Bowe et al., 2021); Long COVID (Ayoubkhani et al., 2021); Mental health outcomes (Xie et al., 2022); Cardiovascular outcomes (Xie et al., 2022)

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- Long COVID and labor supply:
Survey evidence (Davis et al., 2021; Evans et al., 2021; Ziauddeen et al., 2022); Fischer et al. (2021) on soccer players; Ham (2022) in Understanding America Study (UAS)

Contributions

- New way to proxy for Covid-19 illness in representative household surveys
- First large-scale retrospective cohort study to examine direct effects of Covid illness on economic outcomes and develop population-level aggregates of labor supply losses
- “Revealed preference” method of ascertaining long-term consequences of Covid-19 illness

Health-Related Absences in the Current Population Survey

“What was the main reason (you/he/she) (was/were) absent from work last week?”

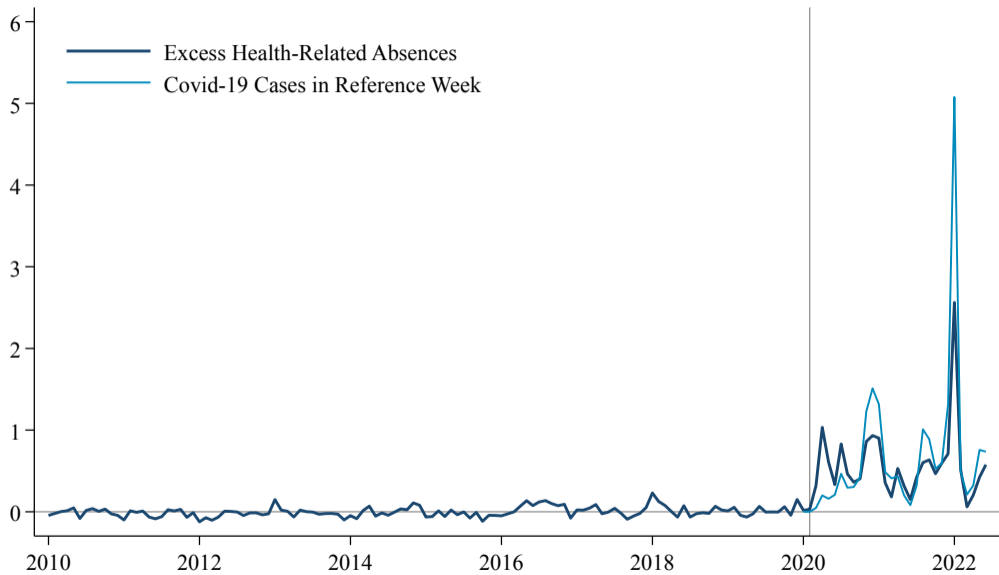
- On layoff (temporary or indefinite)
- Slack work/business conditions
- Waiting for new job to begin
- Vacation/personal days
- Own illness/injury/medical problems
- Child care problems
- Other family/personal obligation
- Maternity/paternity leave
- Labor dispute
- Weather affected job
- School/training
- Civic/military duty
- Does not work in the business
- Other

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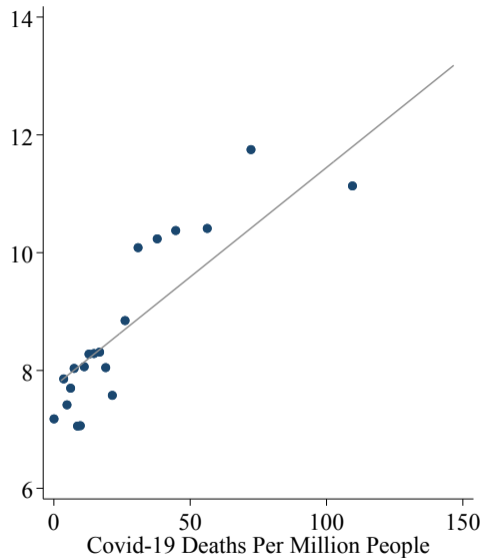
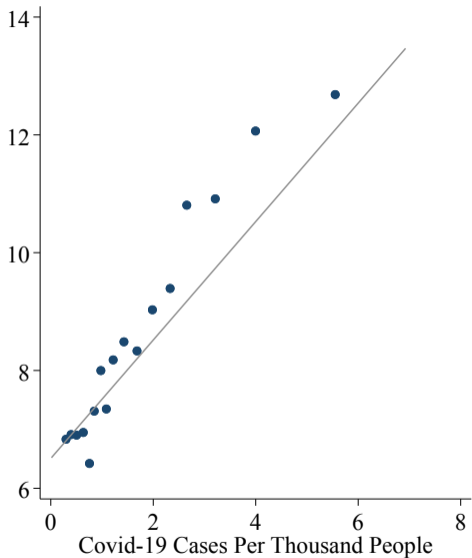
Millions



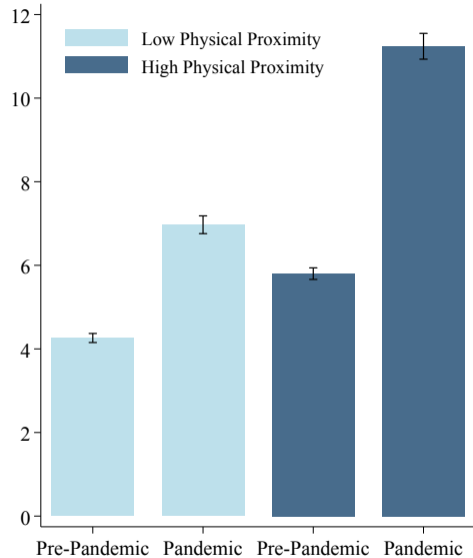
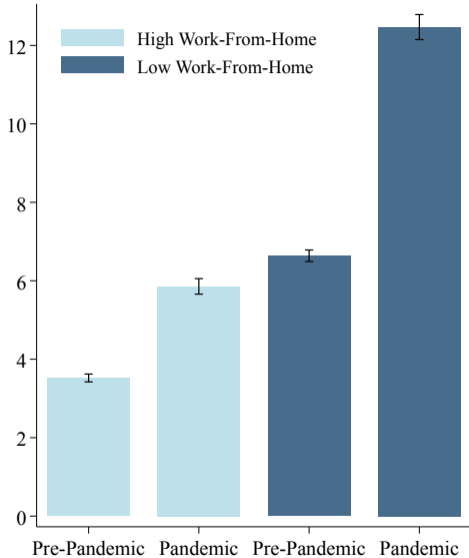
Level & Seasonal Trend

Hours Reductions

Health-Related Absences Per Thousand Workers



Health-Related Absences Per Thousand Workers



Event Study Approach

Use local-projections difference-in-difference approach (Girardi et al., 2022):

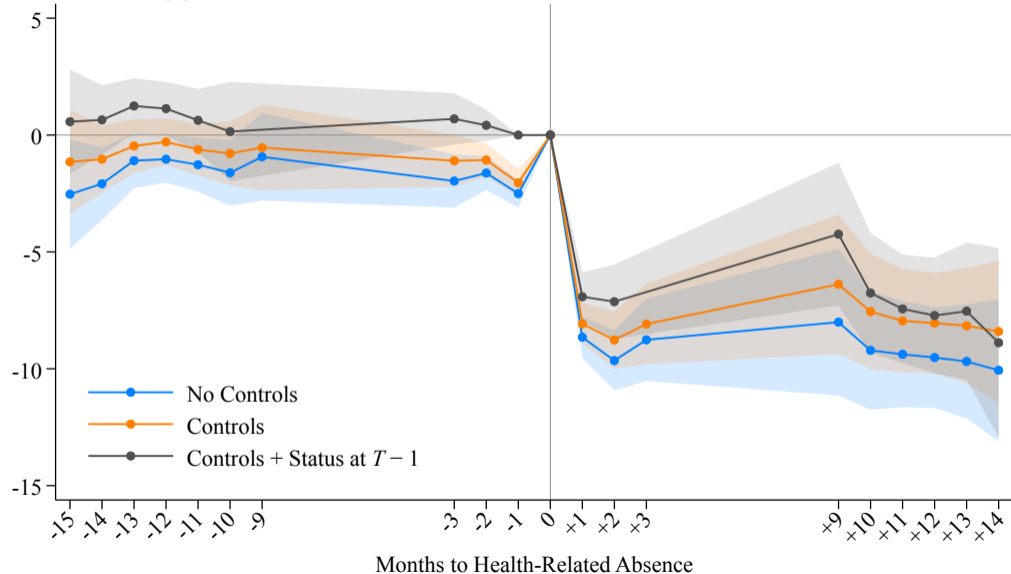
$$LF_{i,t+h} = \beta_h \text{HRA}_{i,t} + \mathbf{X}_{i,t} \boldsymbol{\Lambda}_h + \phi_{s,t+h} + u_{i,t+h}.$$

- $LF_{i,t+h}$: labor force participation at h -month horizon
- $\text{HRA}_{i,t}$: indicator for health-related work absence (0/1) during pandemic
- $\mathbf{X}_{i,t}$: pre-illness observables (demographics, pre-illness labor market status)
- $\phi_{s,t+h}$: state-month fixed effects

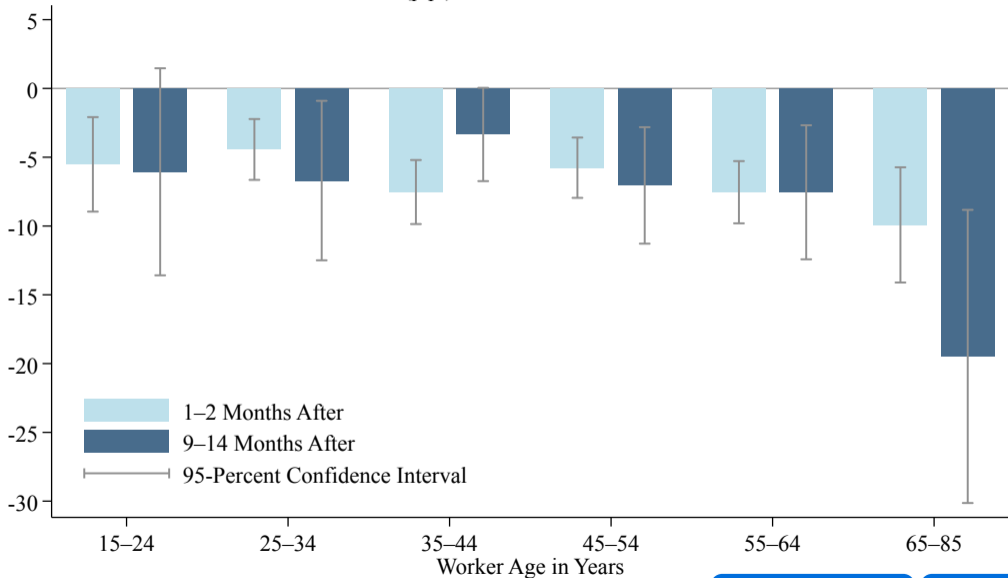
Sample restrictions:

- Employed at t (must be employed to be absent)
- Either ill uniquely at t or never ill while in sample (“clean controls”)
- Exclude people with physical disabilities or pre-illness “medical history”

Estimated Effect (p.p.)



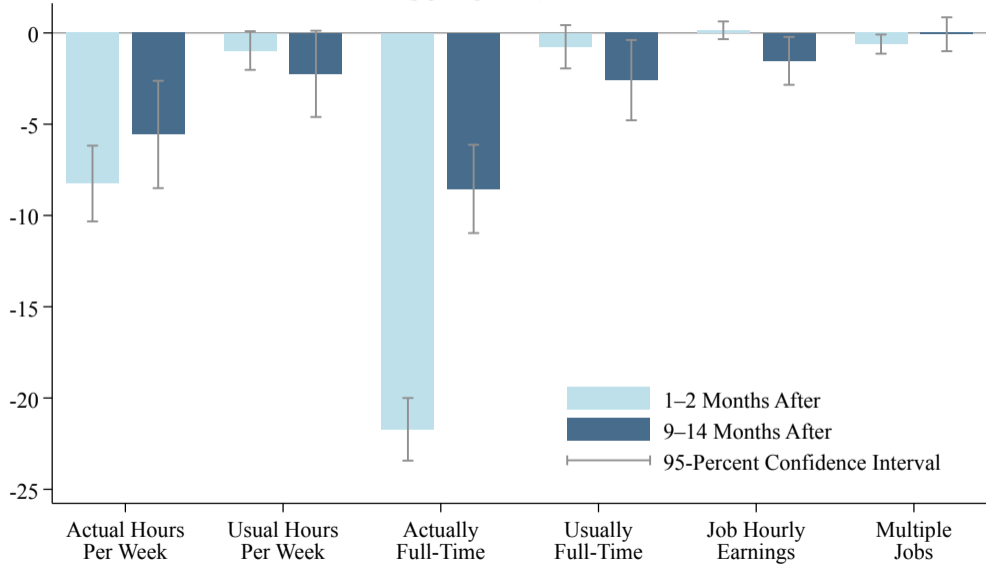
Estimated Effect of Health-Related Absence (p.p.)



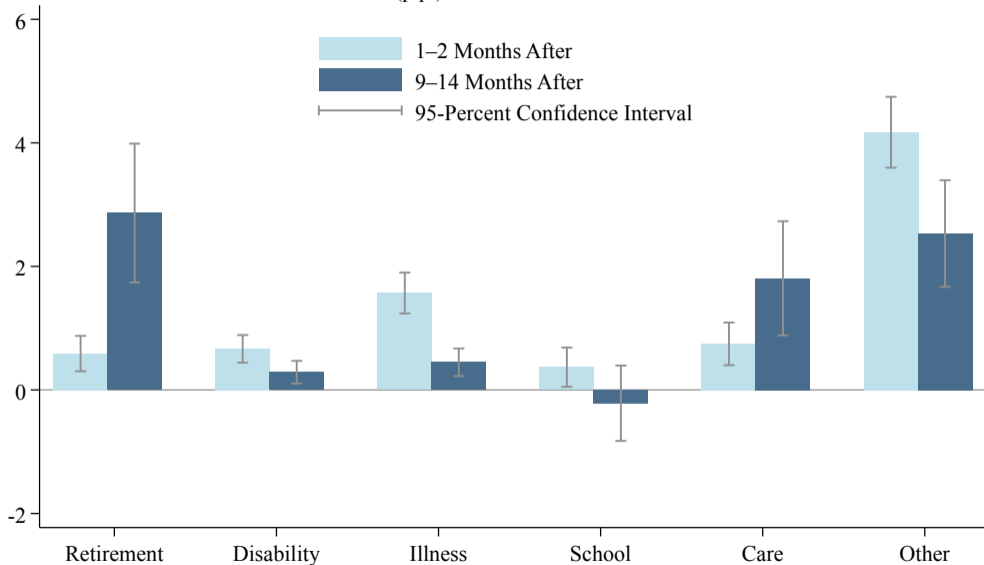
Estimated Effect of Health-Related Absence (p.p.)



Estimated Effects of Health-Related Absence (p.p. or percent)



Estimated Effect of Health-Related Absence (p.p.)



Validating the Event Study

Are these estimates appropriate for Covid-19 illnesses?

- Absence effects are unrelated to state-month Covid-19 case rates [Go](#)
- Some decline in absence effects over time (pre-pandemic versus pandemic) [Go](#)
- Ill-to-nonparticipant flow rate is elevated in CPS summary statistics [Go](#)

Additional checks

- Minimal differential attrition on health-related absence in panel [Go](#)
- Bound bias from unobservable ill-health using observable ill-health [Go](#)

Translating Event Study Results into Aggregate Impacts

We apply our event-study estimates to the excess number of health-related absences:

$$\sum_h \widehat{\beta}_h (\text{AbsenceRate}_{t-h} - \text{AbsenceRate}_{\text{pre},t}),$$

Baseline estimates: 500,000 to 900,000 lost from labor force due to Covid-19 (0.2% to 0.3% of adults) as of June 2022

- *Lower bound* ($\beta_h = 0$ for all $h > 14$): assumes all dropouts return to labor force 15 months after their health-related absence
- *Upper bound* ($\beta_h = \beta_{14}$ for all $h > 14$): assumes event-study effects are permanent

→ Steady-state (at 2021-average health-related absence rate) for lower bound calculation is near June 2022 point-in-time estimate

	(1)	(2)	(3)	(4)	(5)	(6)
	Estimated Effect		Average Forgone Earnings (at \$887/week)			
Margin	1-3 Months After	9-14 Months After	Absence	1-3 Months After	4-14 Months After	Total
Employment	-9.2 p.p. (0.6)	-8.2 p.p. (1.2)	887 (29)	975 (74)	3,208 (492)	5,070 (594)
Hours	-8.5% (1.1)	-5.8% (1.6)	0 (0)	901 (123)	2,269 (632)	3,170 (755)
Job Earnings	0.0% (0.3)	-1.9% (0.7)	0 (0)	-3 (27)	733 (278)	730 (305)
Total			887 (29)	1,874 (224)	6,210 (1,401)	8,970 (1,683)

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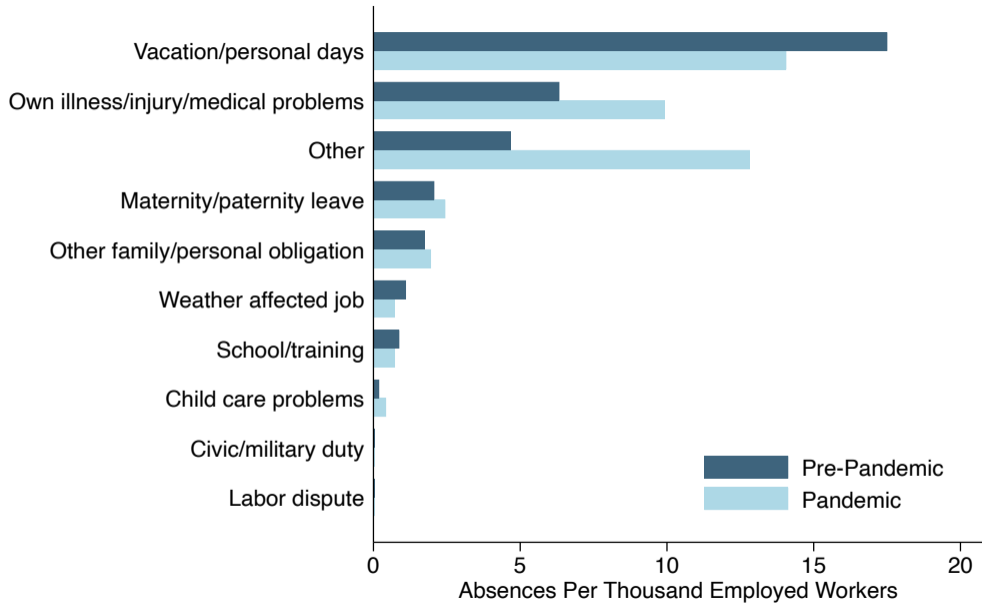
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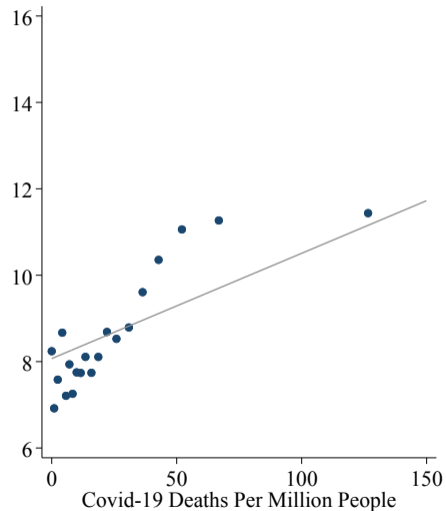
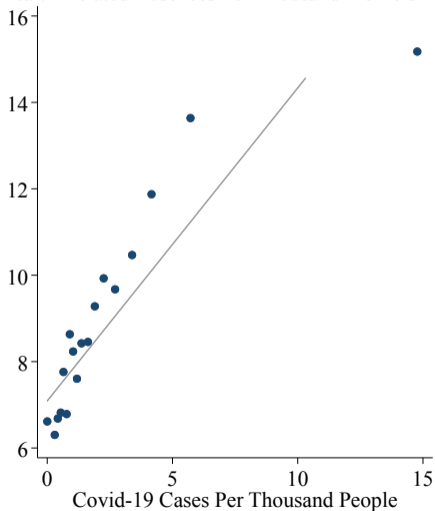
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Appendix

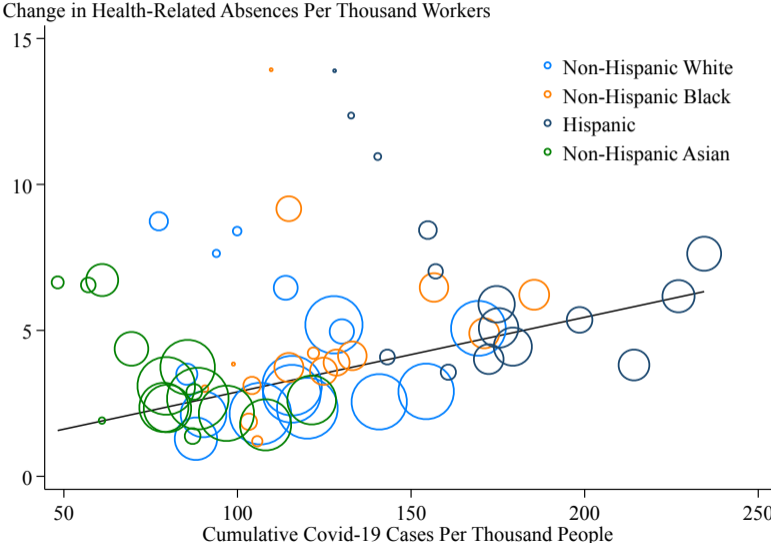


County-Month Binned Scatterplots (Cattaneo et al., 2019)

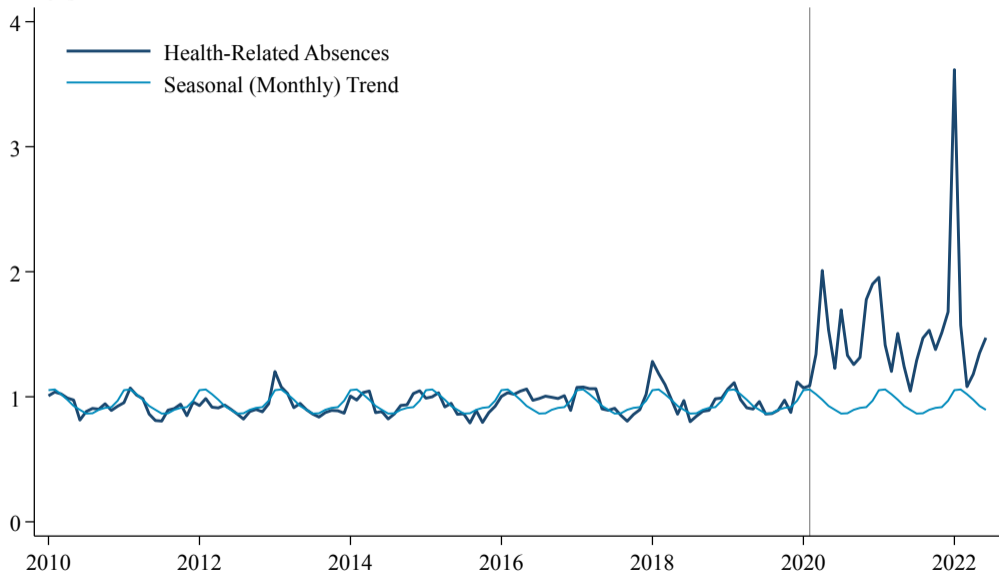
Health-Related Absences Per Thousand Workers



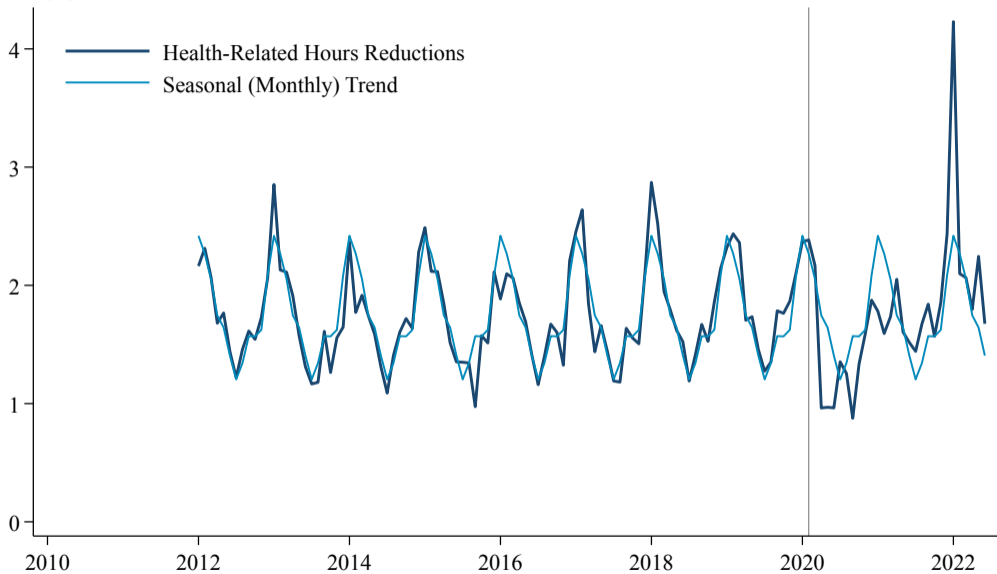
Covid-19 Cases vs. Health Absence Increase, By Demographic Group



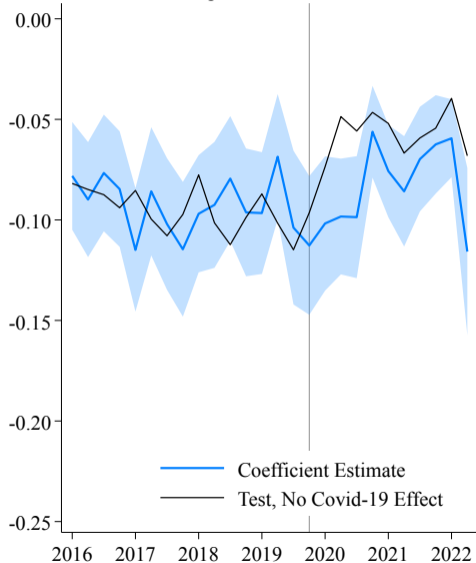
Millions



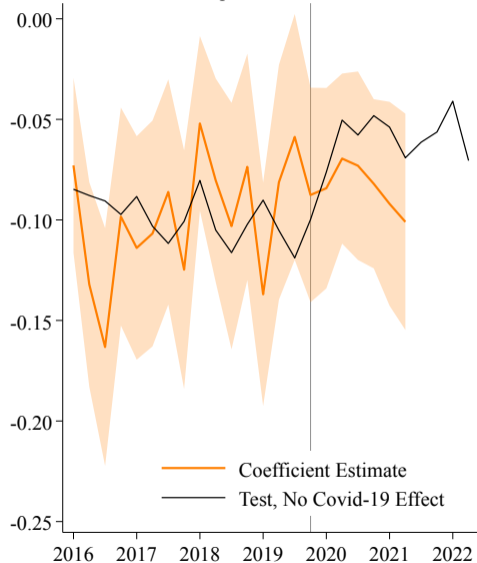
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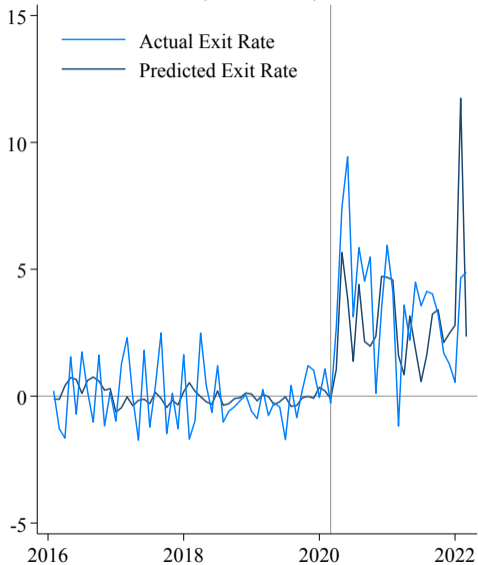
1-Month Effect on Participation



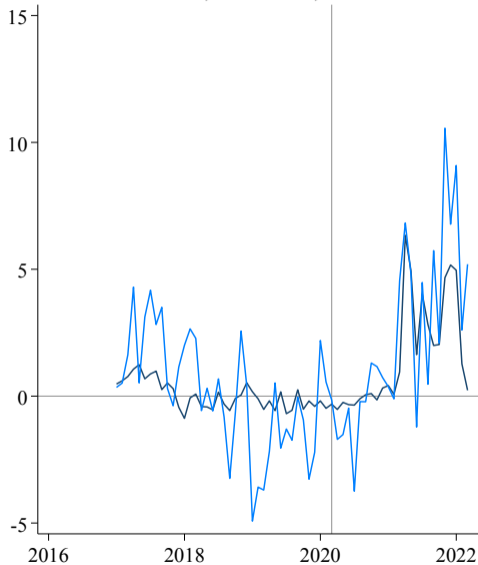
12-Month Effect on Participation



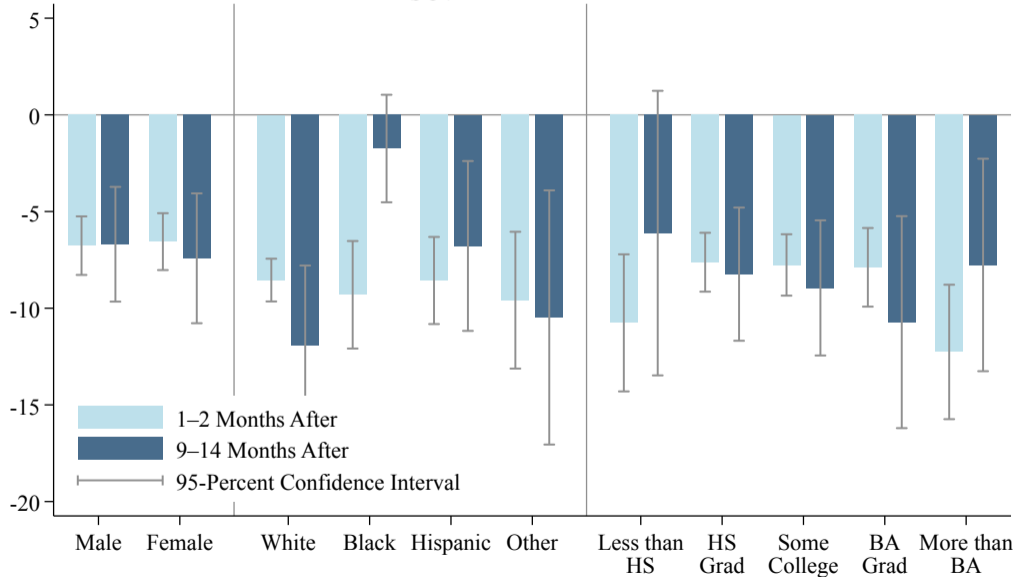
Ill-to-NILF Flows Per 10,000 Workers, 1 Month Later



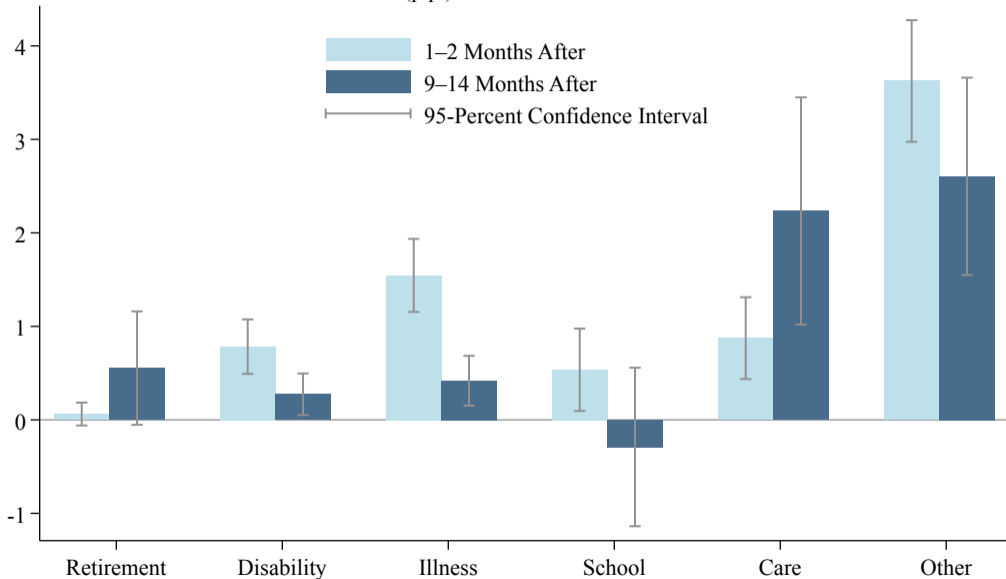
Ill-to-NILF Flows Per 10,000 Workers, 12 Months Later



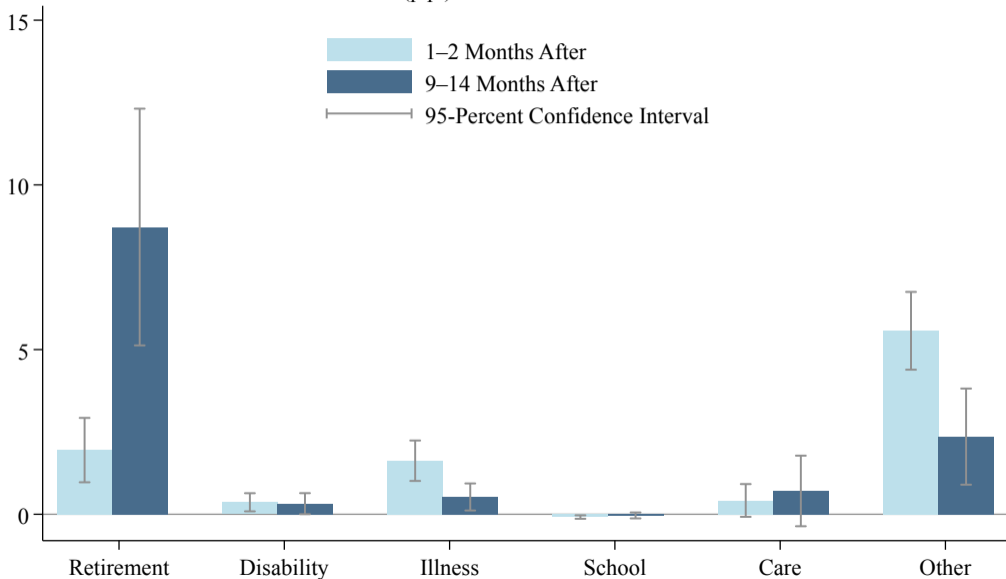
Estimated Effect of Health-Related Absence (p.p.)

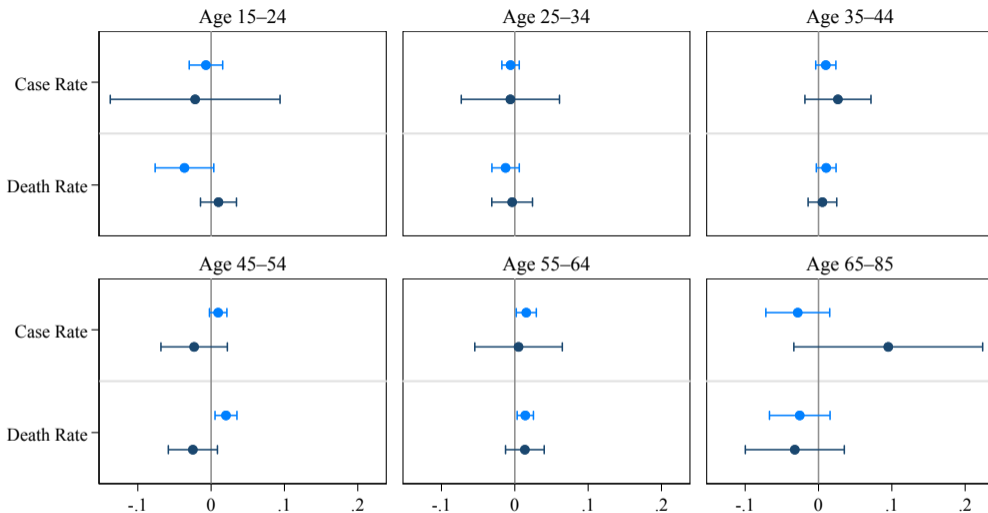


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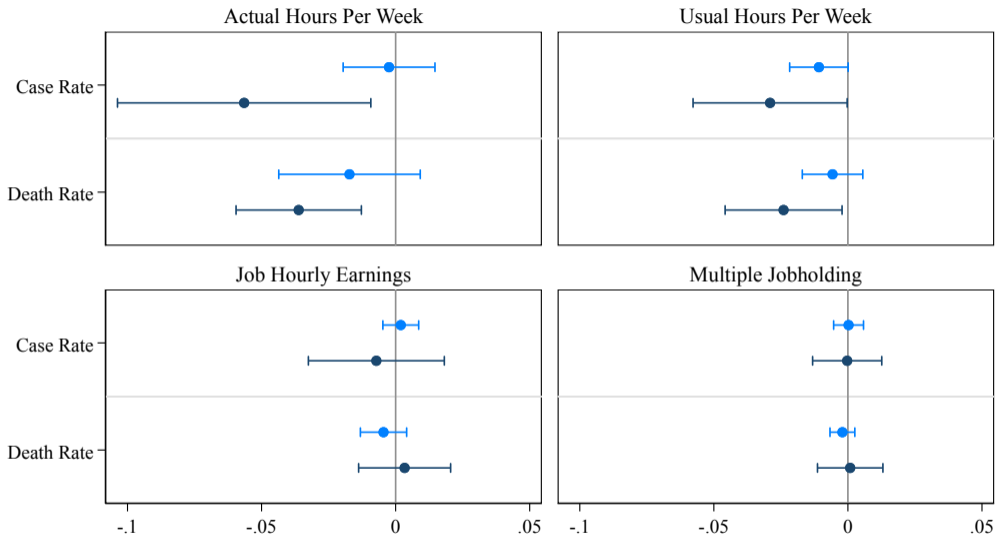




Interaction Effect of a 1 SD Increase in the Case/Death Rate

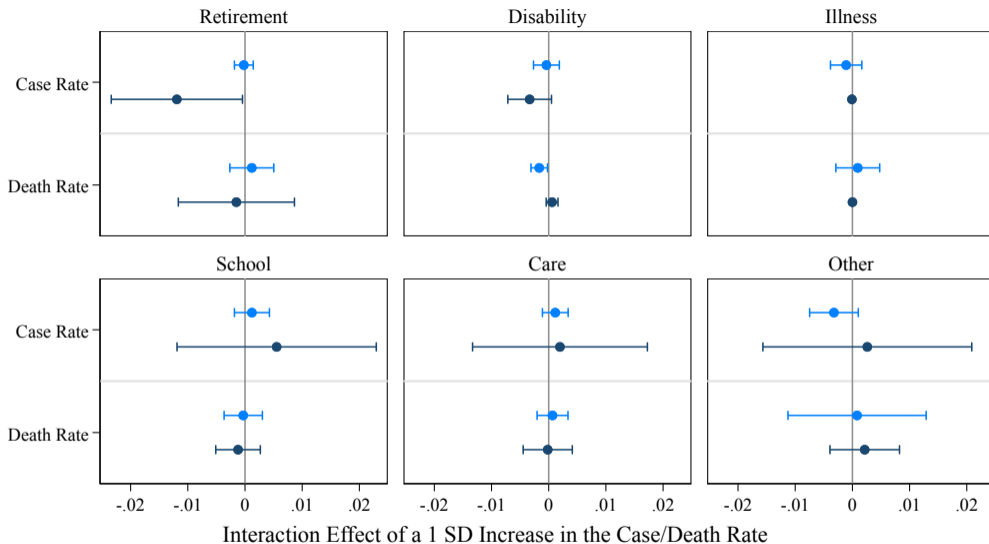
● 1 Month After Health-Related Absence

● 12 Months After Health-Related Absence



● 1 Month After Health-Related Absence

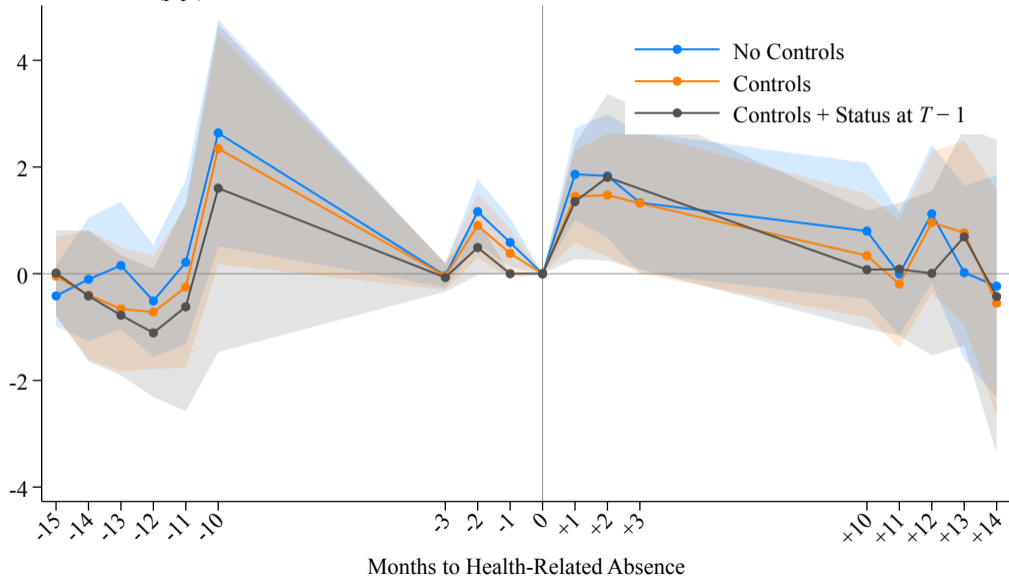
● 12 Months After Health-Related Absence



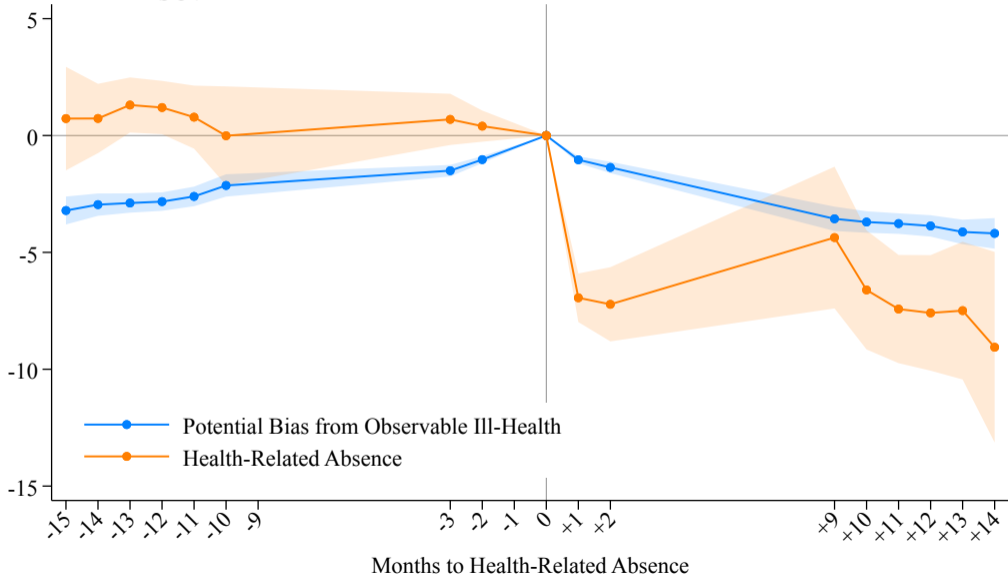
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Estimated Effect (p.p.)



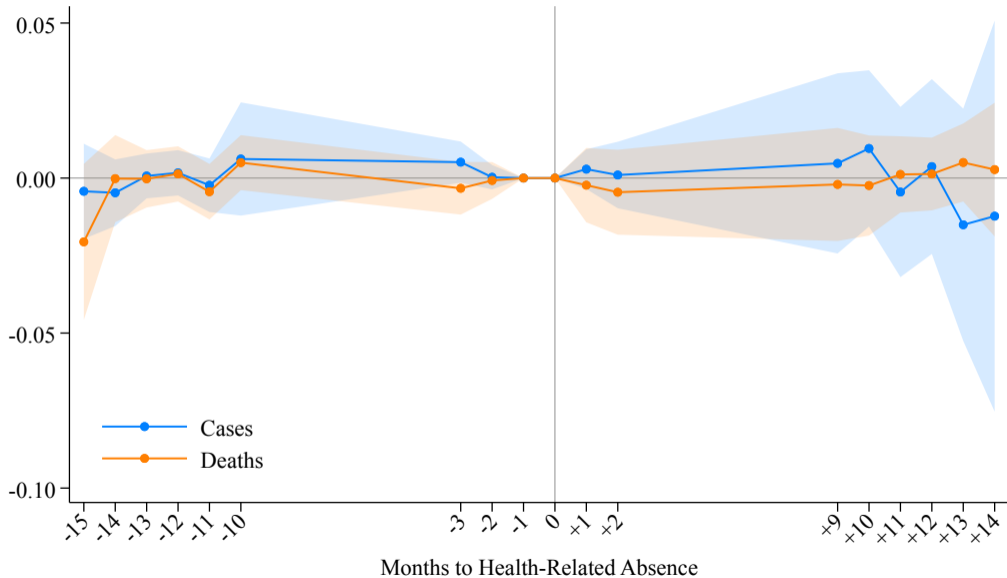
Estimated Effect (p.p.)



$$LF_{i,t+h} = \beta_h \text{HRA}_{i,t} + \gamma_h (\text{HRA}_{i,t} \times Z_{i,t}) + \mathbf{X}_{i,t} \boldsymbol{\Lambda}_h + \phi_{s,t,h} + u_{i,t+h}.$$

	1 Month		12 Months	
	(1)	(2)	(3)	(4)
Health-Related Absence	-0.065*** (0.005)	-0.064*** (0.006)	-0.084*** (0.014)	-0.084*** (0.014)
× Standardized Case Rate	0.001 (0.007)		0.005 (0.017)	
× Standardized Death Rate		0.000 (0.007)		0.006 (0.017)
People	201,014	194,392	58,287	58,287
Illnesses	3,753	3,585	1,157	1,157

Coefficient Estimate on Interaction Term



Dep. Var.: Health-Related Absences Per 1,000 Employed Workers

	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)
Low WFH × Pandemic	3.495*** (0.284)		2.899*** (0.309)	2.822*** (0.308)	1.672*** (0.351)	1.863*** (0.409)	1.030** (0.455)	1.142** (0.530)
High PP × Pandemic		2.730*** (0.283)	1.678*** (0.307)	1.675*** (0.305)	1.185*** (0.314)	0.619 (0.391)	0.975*** (0.362)	0.865* (0.443)
Observations	3,569,017	3,569,017	3,569,017	3,568,590	3,567,755	3,567,755	3,567,755	3,567,755
Clusters	803,451	803,451	803,451	803,314	803,060	803,060	803,060	803,060
State-Month FE				✓	✓	✓	✓	✓
Demographic FE				✓				
Demographic × Pandemic FE					✓	✓	✓	✓
Industry × Pandemic FE						✓		
Major Occ. Group × Pandemic FE							✓	
Detailed Occ. Group × Pandemic FE								✓