Intro	Data	Regressions	Robustness	Model	Conclusion

Research Output Before and During the Pandemic

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The analysis and conclusions set forth are those of the author and do not represent the views of my employer.

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- Big picture: Should the negative productivity findings based on call center and data entry workers be generalized and extended to the entire knowledge workforce?



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- Big picture: Should the negative productivity findings based on call center and data entry workers be generalized and extended to the entire knowledge workforce?
- Instead, what are the productivity outcomes of fully remote work for individuals that tend to be highly motivated with advanced degrees?



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- Ask yourself or any economist...
- What is the likely effect of fully remote work on productivity?



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The effect on productivity of fully remote work is heterogeneous.

For some, the effects may be negative, while for others, the effects may be positive.

- Call center, data entry workers: Negative
- Highly motivated w/ advanced degrees: ????



Literature about **fully remote** has documented objective (not self-assessed) positive outcomes for decades.

- Geisler (1978): 26% higher productivity for key coders working at home vs in-office for Blue Cross Blue Shield South Carolina.
- Phelps (1980): 48% higher productivity for course development managers at Mountain Bell in Denver.
- Newman (1989): 20% higher productivity for programmers at Travelers Insurance Company.
- Dubrin (1991): 29.9% higher productivity for data entry workers at NPD Group in New York.
- Loy et al (2003): 150.1% higher productivity for call center workers at Kentucky American Water Company.
- Collins (2005): 23% higher productivity for insurance techs at Lloyd's Insurance in the UK.

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Again, goal is to convince you that...

The effects of fully remote work on productivity are potentially heterogeneous.

Two other studies speak to the potential heterogeneity.

- Dutcher (2012) provides experimental evidence that
 - Remote work for simple, repetitive tasks was associated with 10 percent lower productivity.
 - Remote work for tasks requiring **critical thinking and creativity** associated with 20 percent **higher productivity**.
- Monteiro, Straume, and Valente (2019) study Portuguese firms (2011-2016)
 - Remote work had **negative productivity** association with firms primarily employing **low-skilled workers**.
 - In contrast, remote work had significantly **positive productivity** effects for firms that undertake **research and development** (R&D) activities.

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 - Largest gains accrued to top 10 schools.
- However, Jiang et. al (2022) look at top 1,000 schools and find an overall **decline** in productivity, with increased inequality.
 - Extra time spent on teaching had an important negative effect.

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- What was the impact on collaboration?
- Was there any effect on inequality among economists?
- Can a general equilibrium model rationalize any of the findings?
- What would be the macroeconomic effects?
 - Important because increases in productivity tend to reduce inflation.

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• We examined working paper output from the 12 Federal Reserve System regional banks as well as a richer measure of output for Board authors

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- Working papers are a consistent and relatively parsimonious measure which persists across all regional banks.
 - Avoids issues associated with lag times related to publication process.

• We use quarterly output per author as our measure of interest and construct a time series for each author.



- Working papers are obviously just one dimension of output.
 - For the 12 regional banks, we do not include publications, revisions, book chapters, notes, and other research contributions.

- Output related to policy work is not included yet also important.
- Some economists use SSRN to release new papers, which we are not tracking.



Pandemic was a unique time period, one perspective on results coming from the Pandemic...

- A land-grab of papers on COVID
- More demand for papers on COVID
- Short-run/long-run trade-off
 - Less time on conferences,
 - Less lunch with colleagues
 - More just pumping out papers

As robustness checks,

- We can exclude Covid papers
- We can exclude 2020.
 - Vaccine was widely available in 2021 i.e. more in-person activities.
- We can check 2008 financial crisis, another land-grab event.


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Intro Data Regressions Robustness Model Conclusion Observed Observed Observed Observed Observed Observed How Did We Collect & Refine The Data?

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- 507 Authors, 2,400 research pieces from the Board





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Takeaway: Entire system had about 25% increase in output.

Previous results were just summary statistics.

• Regressions provide for more formal analysis and controls.

Given that we are using count data, which is zero-bounded and right-skewed, we use Poisson regressions in addition to linear regressions.

• Cohn, Liu, and Wardlaw (2022) show Poisson regressions are more appropriate for this type of data.

Poisson regressions assume dependent variable follows a Poisson distribution and assumes the log of its expected value is linearly related to the independent variables.

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We also control for author fixed effects.

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Main	Regression	Results:	Quarterly	Output per A	Author
	Linear	Poisson		Linear	Poisson
Panel A: F	ederal Reserve Regiona	l Banks	Panel I	B: Board of Governors	
Covid	0.041 ^{***} (3.29)	0.170** (3.33)	** Covid	0.091*** (6.32)	0.282 ^{***} (6.39)
Constant	0.223*** (37.83)		Consta	nt 0.276*** (42.61)	
Observatio	ns 6369		Observ	ations 7559	

	Linear	Poisson
Panel C: Com	pined	
Covid	0.068*** (7.03)	0.239*** (7.13)
Constant	0.252*** (56.32)	
Observations	13928	

Constant: 0.252 x 4 \approx about 1 working paper per year per economist for pre-Covid. Regional Banks had 17.0%, Board had 28.2%, and Combined 23.9% increases. Takeaway: Large significant gains across entire system during pandemic

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We split the sample up into the top and bottom half based on Pre-Covid production.

	Linear	Poisson
Panel C: Combined		
Covid	0.130*** (12.46)	0.864*** (12.87)
Top Half	0.308*** (26.10)	1.451*** (24.30)
Covid x Top Half	-0.125^{***} (-6.53)	-0.854^{***} (-10.94)
Constant	<mark>0.094^{***}</mark> (18.69)	-2.361^{***} (-44.15)

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Pre-Covid

Constant: $0.094 \approx$ about 0.5 papers per year for bottom half of distribution Pre-Covid. Top Half: $0.308 \implies 0.308 + 0.094 \approx$ about 1.5 papers per year for top half.
 Intro
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 Quarterly
 Output
 per Author:
 Top
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Top Half: $0.308 \implies 0.308 + 0.094 \approx \text{about } 1.5 \text{ papers per year for top half.}$

During Covid

Covid: 0.130 bottom half of distribution nearly doubled its output (0.130 + 0.094).

Covid x Top Half : $-0.125 + 0.130 = 0.005 \implies$ top half remained productive but unchanged.

Takeaway: Gains in output were driven by bottom half of distribution. Inequality declined.

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Quarterly	Outp	ut per Author:	Female	effect	
	-	Linea	ar Po	visson	

	Linear	Poisson
Panel C: Combine	ed	
Covid	0.069*** (6.00)	0.240 ^{***} (6.06)
Female	-0.009 (-0.63)	-0.037 (-0.62)
Covid × Female	-0.011 (-0.49)	-0.029 (-0.35)
Constant	0.255*** (35.41)	-1.367*** (-48.40)

Pre-Covid

Constant: $0.255 \approx$ about 1 paper per year for males Pre-Covid.

Female: $-0.009 + 0.255 \implies$ insignificant difference for Pre-Covid (T-stat = -0.63).

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During Covid

Covid: 0.240 \implies males increased output by 24%.

Covid x Female : $-0.029 + 0.240 \implies$ females increased by 21%, insig. diff. (T-stat = -0.35). Takeaway: No significant difference between males and females (pre and during Covid). Contrasts with evidence from university professors, which found significant difference.

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	Under 8 years	8 to 22 years	Over 22 years	
Panel C: Combined Poisson				
Covid	0.202***	0.340***	0.205***	
	(5.25)	(6.50)	(5.11)	
Age group	-0.051	0.428***	-0.476***	
	(-0.74)	(8.50)	(-8.38)	
Covid × Age group	0.160^{*}	-0.176^{**}	0.084	
	(1.75)	(-2.52)	(1.07)	
exp(Constant)	0.255***	0.199***	0.291***	
	(3.93)	(3.72)	(3.77)	

Under 8 Years Since PhD

Covid x Age Group: $0.160 \implies 16\%$ more output than rest during Covid.

Covid + Covid x Age Group : 0.202 + 0.160 = 36.2% more output compared to Pre-Covid.

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Takeaway: Youngest cohort gained most during the pandemic.

This goes against the view that youngest do poorly under fully remote.

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8 to 22 Years Since PhD

Covid × Age Group: $-0.176 \implies 17\%$ less relative output than everyone else during Covid. Covid + Covid × Age Group : 0.340 - 0.176 = 16.4% more output compared to Pre-Covid. Takeaway: Although gains were not as large as other age groups, still significantly positive.

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More than 22 Years Since PhD

Covid x Age Group: 0.084 \implies 8% more output than others during Covid.

Covid + Covid x Age Group : 0.205 + 0.084 = 28.9% more output compared to Pre-Covid. Takeaway: Gains relative to other cohorts were positive but insignificant.

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- Gains could be driven by presence of new research ideas and not fully remote.
 - This view rests on the assumption that the constraining factor on researchers prior to Covid was not time, but limited number of research ideas.
- The Global Financial Crisis is another time period in which there was a new shock to do research on.

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- Yet there were no changes in WFH policies over this time period.
- Could possibly serve as a good period for comparision.

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Compare number of working papers from 2005 to 2008 vs 2009 to 2010.



- Board working papers declined 18% during financial crisis.
- System-wide including Board, average. papers declined from 397 to 394.5 on annual basis.

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Takeaway: Didn't see large increase in research output around GFC, in contrast to Covid.

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Quarterly	Output	per Author:	Excluding	2020	

	Poisson		Linea	r
Fixed Effects	No	Yes	No	Yes
Combined				
Covid	0.127*** (3.03)	0.109*** (2.68)	0.037 ^{***} (2.98)	0.032 ^{***} (2.65)
Constant	-1.296*** (-49.32)		0.274*** (38.05)	0.275 ^{***} (65.84)

• Covid: 10.9% significant increase.

Takeaway: Excluding 2020, effect remains economically large and significant.

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Quarterly	Output	per Author	Excluding	Covid Papers	5
Intro	Data	Regressions	Robustness	Model	Conclusion
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	Poisson		Linea	r
Fixed Effects	No	Yes	No	Yes
Combined				
Covid	0.102*** (2.84)	0.109*** (3.12)	0.027*** (2.82)	0.029*** (3.10)
Constant	-1.377^{***} (-55.51)		0.252*** (40.32)	0.252*** (58.62)

Takeaway: Excluding "Covid" or "Pandemic" papers, still significant positive.

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 Authors per Paper: Collaboration

Table: Collaboration: Authors per Paper

	Poisson	Linear	Poisson	Linear
Combined				
Covid	0.0713 ^{***} (4.07)	0.224 ^{***} (4.04)	0.105 ^{***} (3.92)	0.331 ^{***} (3.93)
Trend Effect			-0.0184 (-1.56)	-0.0573 (-1.56)
Constant	1.111**** (97.51)	3.038*** (87.74)	1.126*** (73.99)	3.083 ^{***} (65.40)

• Constant: 3.083 \approx 3 authors per paper for pre-Covid.

• 10.5% increase in authors per paper during Covid.

Takeaway: Significant increase in collaboration across the system (even when controlling for trend).

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 Some reasons
 WFH may increase output

The following items listed in Bloom et al (2022):

- Average U.S. employee saves about 70 minutes a day by avoiding having to commute and prepare for work, which is split into both additional work and leisure.
- Home working is often better for individual focused activities like coding or writing as it is usually quieter.
- Allows for greater time flexibility.

Choudhury et al (2021)

- WFH allows workers to control ambient workspace such as clothing, layout, ventilation, etc.
- Theorizes that those that self-select into WFH will experience greater satisfaction and utility, and will exert greater productivity-enhancing effort in appreciation of this nonpecuniary benefit.

Intro	Data	Regressions	Robustness	Model	Conclusion
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General	Equilibriu	m Model			

We use a standard New-Keynesian model with endogenous growth.

• Endogenous growth allows for potential effects on productivity.

Given Bloom et al. (2022) finds 70 minutes a day in savings....

We simulate a 1% exogenous increase in the time endowment.

• Given typical model has households working a third of the time, the total endowment is typically 120 hours a week, 40 of which are devoted to labor.

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• A one percent increase is roughly an additional hour per week, consistent with the findings of Aksoy et al. (2023).



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Time endowment persistently rises (lower right).

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Labor supply rises by about 0.35% and leisure rises 0.65% (top row).

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Increased labor supply translates to higher output and consumption growth.



Also associated with higher R&D investment and idea accumulation.

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Higher idea accumlation spills over to aggregate productivity (third row).



Higher labor supply is associated with lower real wages and lower inflation.

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The lower inflation leads to lower risk-free rate which causes the 10y-3month spread to rise.





Aggregate productivity jumped well above trend and then came back to trend.

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Rise in producitivity and recent decline are consistent with model implications based on increase in time endowment and decrease associated with RTO.

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Intro	Data	Regressions	Robustness	Model	Conclusion
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Conclusio	on				

- We find that research output significantly increased during fully remote.
- The bottom half of the distribution was responsible for the large gains.
- In addition, the increase was driven by under 35 and 50 plus.
- There was no significant difference between males and females.
- Collaboration as measured by authors per paper significantly increased.
- Findings can be rationalized in GE model with exogenous increase in time endowment.
- Caveat: This study is just about productivity, there's other important aspects.

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• There exists a scenario that combines positive aspects of fully remote and hybrid:

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• There exists a scenario that combines positive aspects of fully remote and hybrid:

Cluster Hybrid




• There exists a scenario that combines positive aspects of fully remote and hybrid:

Cluster Hybrid

- Cluster Hybrid brings everyone together for 4-5 days every 6 or so weeks.
 - Many of the benefits of fully remote work.
 - Cost savings. Nationwide talent search. People can live where they want.

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Intro	Data	Regressions	Robustness	Model	Conclusion
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Final Tho	ought				

• There exists a scenario that combines positive aspects of fully remote and hybrid:

Cluster Hybrid

- Cluster Hybrid brings everyone together for 4-5 days every 6 or so weeks.
 - Many of the benefits of fully remote work.
 - Cost savings. Nationwide talent search. People can live where they want.
 - Also have the in-person culture building of hybrid.

Fully Remote	<u>*Cluster Hybrid*</u> 4 Days every 6 weeks	Hybrid 3 Days a Week	Fully In-Person	

- Hire talent nationwide.

- Save real estate costs.

- Minimize daily commute.

-Establish in person connections and culture.

- Can only hire within driving distance of office.
- Workers must frequently commute, higher real estate costs.