Work-from-Home, Disability Employment, and the Decline in Supplemental Security Income

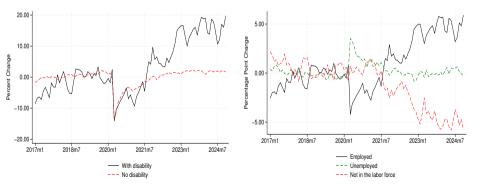
Octavio M. Aguilar Federal Reserve Board of Governors

> RA Brown Bag January 30, 2025

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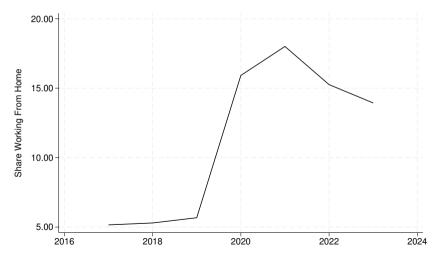
Surge in Disability Employment

- Entire increase in disability employment post-pandemic is driven by rising labor force participation.
 - ► Trend is also documented by Ne'eman and Maestas (2022); Bloom, Dahl, and Rooth (2024).



Concurrent Surge in WFH

- ▶ At the same time, remote work has increased by 3 fold.
 - From 6% pre-pandemic to a peak of 18% in 2021.



Americans With Disabilities Act (ADA)

- ▶ ADA of 1990 requires employers to provide reasonable accommodations, which allows individuals with a disability to have an equal opportunity to get a job and successfully perform their job to the same extent as people without disabilities.
 - Includes physical changes, accessible and assistive technologies, and policy enhancements.
- ► However, it is not necessary to provide a reasonable accommodation if doing so would cause an undue hardship.
 - For example, if the accommodation is costly, extensive, disruptive, or would fundamentally alter the nature or operation of the business.
 - Prior to the pandemic these accommodations were limited Acemoglu and Angrist (2001); Kaye et al. (2011); Dahl, Bloom, and Rooth (2024).

WFH Transformed Flexible Work Arrangements

- ► The pandemic introduced a technology shock where firms were forced to restructure and provide remote work options for **all** workers.
- Share working from home increased by three fold for both workers with and without a disability.

A natural question is: Does the ability to WFH increase employment of individuals with a disability?

WFH Transformed Flexible Work Arrangements

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A natural question is: Does the ability to WFH increase employment of individuals with a disability?

- ► The answer is **YES!**
- ▶ Bloom, Dahl, and Rooth (2024) have an excellent paper showing a 1pp \uparrow in WFH $\Rightarrow 1.1\% \uparrow$ in full-time employment for individuals with a disability.
- ► They show that most of the rise in disabled employment post-pandemic can be explained by WFH.

This Paper

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Research Question:

Does the ability to WFH decrease SSI for individuals with a disability?

▶ **Yes!** 1pp \uparrow in WFH \Rightarrow 0.36% \downarrow in SSI.

Outline for Today

- 1. Data construction and definition of disability.
- 2. Trends in SSI overtime.
 - SSI recipients and real average labor income of SSI recipients.
- 3. The causal link between SSI and WFH.
 - Evidence from individual and occupation-level regressions using the CPS.
- 4. Mechanisms and concluding remarks.

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- 4. Estimation sample is from 2017-2023, includes individuals between 18 and 64, and CPS sampling weights are used.

Definition of Disability

The CPS uses a set of six questions to identify persons with disabilities.

- ▶ **Hearing:** is anyone deaf or does anyone have serious difficulty hearing?
- ▶ **Vision:** is anyone blind or does anyone have serious difficulty seeing even when wearing glasses?
- Ambulatory: does anyone have serious difficulty walking or climbing stairs?
- Self-care: does anyone have difficulty dressing or bathing?
- ▶ Independent living: because of a physical, mental, or emotional condition, does anyone have difficulty doing errands alone such as visiting a doctor's office or shopping?
- ► Cognitive: because of a physical, mental, or emotional condition, does anyone have serious difficulty concentrating, remembering, or making decisions?

Definition of Work from Home

- ▶ Baseline definition of WFH is the ACS transportation to work question.
 - "Primary means of transportation to work on the most recent day worked?" (e.g., car, bus, bicycle, or worked from home).
 - ► Calculate the WFH rates by occupation using **only non-disabled workers**.

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 - Calculate the WFH rates by occupation using only non-disabled workers.
- Alternative definitions of WFH:
 - CPS telework question (2022-onward only): "in the last week, did you telework or work at home for pay?"
 - Job ads: number of jobs ads that are WFH by occupation.
 - Instrument: pre-determined probability an occupation can be done from home.
 - 2019 measure from Dingel & Neiman.

Definition of SSI

"How much did you receive (monthly/quarterly) in Supplemental Security Income payments last year?"

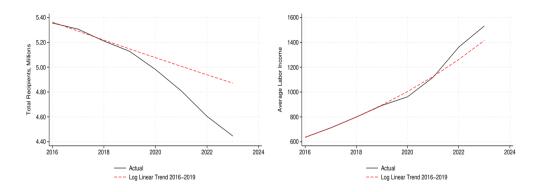
- SSI provides monthly payments to people with disabilities.
 - ▶ Maximum of \approx \$1000 for singles and \approx \$1500 for couples.
- SSI has income requirements.
- ► As of 2024, SSI recipients can't exceed ≈ \$2000 from work each month.
 - ▶ In addition, can't have other sources of income or assets exceeding \$2000.
- ▶ Under the \$2000 earnings threshold, if individuals decide to work, SSI benefits are reduced by 50 cents for every dollar earned over \$85.

Sample Characteristics (Shares in %)

Variable	CPS	CPS-ASEC	
Disability	7	3	
Labor Force Status			
Employed	31	90	
Full-time	67	67	
Part-time	33	33	
Unemployed	2	7	
Not in LF	67	3	
Age (Mean)	49	46	
SSI (Mean)			
Employed	-	313	
Unemployed	-	721	
Hourly Wages (Mean)			
Full-time	21	21	
Part-time	16	16	
Work from home (Mean)	-	11	
		(10)	
Observations	6,192,029	4,217,273	

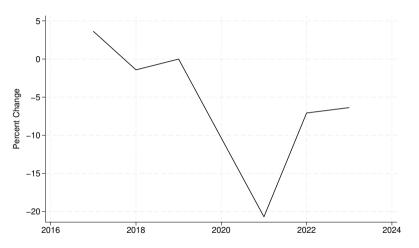
Trends in SSI

Steep Decline in SSI Recipients and Increases in Average Labor Income



- ▶ As of 2023, the number of SSI recipients (left panel) is 9% below trend.
- At the same time, the real average labor income of SSI recipients (right panel) is 8% above trend.

Declines in SSI Post-pandemic



- ▶ On average, SSI fell by 10% post-pandemic.
- ▶ Similarly, in the CPS, SSI fell by 6.7% post-pandemic.

Estimation

Research Design

- ▶ Idea: use variation in WFH across occupations. WFH variation
 - ► WFH occupations should show the largest declines in SSI if WFH meaningfully altered their employment opportunities. SSI by WFH

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- ▶ **Identifying assumption:** changes in WFH are driven by changes in the supply and demand for nondisabled workers, not for workers with a disability.
 - ▶ Isolate the effect of WFH on SSI for disabled individuals without confounding from disability-specific labor market dynamics.

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 - Isolate the effect of WFH on SSI for disabled individuals without confounding from disability-specific labor market dynamics.
- ▶ Analysis: Individual and occupation-level analysis. I will estimate changes in SSI pre-post pandemic and the level of SSI pre-post pandemic.

Identification Challenges

- 1. Compositional changes in disability category.
 - During the pandemic, large inflow of individuals categorized as having a cognitive disability.
 - ▶ If these individuals have more marginal disabilities, they could be more likely to work.
 - ► This could lead to changes in SSI that are not directly caused by WFH but rather by changes in the population composition.
 - Solution: Focus only on the set of disabilities that do not change drastically pre-post pandemic.

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 - **Solution:** Focus only on the set of disabilities that do not change drastically pre-post pandemic.
- 2. Aggregate labor market tightness increased by 60% and may have influenced firms willingness to hire workers with disabilities (Dahl, Bloom, and Rooth, 2024).
 - Could confound my analysis if observed changes in SSI could be driven by shifts in labor market conditions rather than WFH adoption alone.
 - Solution: Control flexibly for non-disabled employment within an occupation and instrument using pre-determined probability that an occupation can be done from home.

Occupation-level Regressions

$$\%\Delta SSI_{j}^{d} = \Delta WFH_{j}^{nd} + f(\%\Delta EMP_{j}^{nd}) + \%\Delta SSI TREND_{j}^{d} + \%\Delta Wage_{j}^{d} + \epsilon_{j}.$$
 (1)

- $ightharpoonup \Delta WFH_{j}^{nd} = WFH_{j,21-23}^{nd} WFH_{j,18-19}^{nd}.$
- ▶ $f(\cdot)$ is a second order polynomial.

Regressor	(1)	(2)	(3)	(4)	(5)	(6)			
Panel A: Outcome regressions									
Dependent Variable: Percent change in SSI									
Δ WFH share	-0.376**	-0.329**	-0.270*	-0.222	-0.339*	-0.355*			
	(0.132)	(0.132)	(0.142)	(0.186)	(0.184)	(0.182)			
	Pan	el B: First st	age regressi	ons					
Panel B: First stage regressions Dependent Variable: Change in occupation WFH share									
WFH probability				1.655***	1.635***	1.589**			
				(0.338)	(0.370)	(0.424)			
SSI trend + controls		✓	✓		✓	✓			
Labor market tightness √						✓			
WFH instrumented				✓	✓	✓			

Interpretation: 1pp \uparrow WFH \Rightarrow SSI Income \downarrow 0.36%. WFH explains roughly 55% of the decrease in SSI: $(0.36 \times 10.2 \text{ppt} = 3.7\%)$ and (3.7%/6.7%) = 55%.

Individual-level Regressions

$$SSI_{i,j,t}^{d} = \delta_t + \delta_{s,t} + \delta_{k,t} + WFH_{i,j,t}^{nd} + \Gamma X_{i,t} + \epsilon_{i,t}.$$
 (2)

- $X_{i,t}$ includes: sex, marital status, race, Hispanic, family size, age, have children, employment status, dividend income, rent income, assistance income, veteran income, survivor income, and changes in SSI trends and wages.
- lacksquare δ_t , $\delta_{s,t}$, and $\delta_{k,t}$ are time, state-by-time and industry-by-time fixed effects, respectively.

	Dependent Variable: SSI in Dollars								
Regressor	(1)	(2)	(3)	(4)	(5)	(6)			
A. Pre-pandemic (2018-2019)									
ACS WFH	-10.97	-8.52	-12.46	-25.86	-22.34	-30.71**			
	(11.13)	(11.92)	(10.31)	(16.76)	(14.27)	(14.76)			
Job Postings	-31.86	-16.46	-23.10	-44.50	-45.34	-57.68**			
	(28.41)	(30.29)	(25.77)	(28.89)	(28.46)	(29.36)			
B. Post-pandemic (2021-2023)									
ACS WFH	-7.51***	-6.27***	-6.64**	-9.07***	-11.05***	-9.72***			
	(2.37)	(2.41)	(3.37)	(3.32)	(3.23)	(3.20)			
CPS WFH	-7.12***	-6.23***	-8.40**	-13.33***	-12.22***	-12.30***			
	(1.92)	(1.98)	(3.73)	(3.85)	(3.58)	(3.61)			
Job Postings	-20.12***	-17.42***	-19.00***	-18.21***	-28.55***	-25.59***			
	(4.25)	(4.32)	(6.82)	(6.67)	(6.87)	(6.75)			
SSI trend + controls		✓	✓		✓	✓			
Fixed effects			✓			✓			
WFH instrumented				✓	✓	✓			

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 - ► Reduced SSI: \$335 \$100 = \$235.

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- ▶ Labor income needed to induce this reduction: $\frac{x-\$85}{2} = \$100 \Rightarrow x = \$285$.

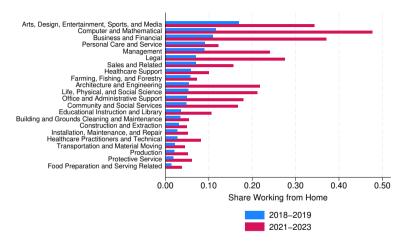
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- Translation into hours worked:
 - For an individual earning the mean hourly wage: \$21.
 - Additional hours worked to earn \$285: $\frac{$285}{21} \approx 14$ hours.

Mechanisms and Concluding Remarks

- ► The pandemic introduced a universal expansion of new technologies, specifically remote work.
 - Expansion applied to all workers and not just targeted for workers with a disability.
- ▶ I find that post-pandemic increase in WFH decreased SSI by roughly 4%.
- ► Labor supply channel: Individuals with disabilities may prioritize the flexibility and accessibility of WFH over retaining supplemental income benefits.
 - In addition, WFH also reduces commuting costs, enables better working conditions, and provides non-pecuniary benefits.

Thank you:)

Variation in WFH

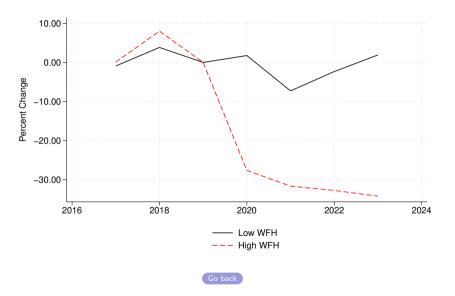


► Business and Financial: ↑ 21pp

► Educational Instruction: ↑ 8pp



Large Decline in SSI for High WFH Occupations



Changes in Population Size With a Disability

